# The Science of Healthy Cities: Deciphering the associations between urban morphometrics and health outcomes

**Chinmoy Sarkar** 

A thesis submitted in fulfilment of the requirements for the degree of Doctor of Philosophy

> School of Planning and Geography Cardiff University May 2013

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To Dad, Mom, Sarika, Rini and Angelina for their constant unconditional love, support and encouragement

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## Abstract

Over the past decade there has been mounting evidence of the significant role played by the myriad attributes of our city's built environments in shaping our health and well-being. This thesis hypothesizes that the constituent components of the built environment, especially the configuration and design of land uses and street networks governs the distribution of resources and services, configures the neighbourhood activity space, and thereby influences individual physical activity behaviours, social interactions, weight outcomes as well as mental health and well being. Enhanced accessibility to health-promoting community resources improves local opportunities for physical activity, thereby enhancing mobility, social interactions and independence as well as reducing isolation.

The first section of this thesis conceptualizes the *urban health niche* as a novel holistic and spatially-explicit paradigm in public health and proposes a health niche model of healthy city. Based on the proposed paradigm and gathered research evidence, multilevel data sets pertaining to health, socio-economic, built and natural environment have been produced and integrated together to constitute the high resolution database, *spatial Design Network Analysis for Urban Health (sDNA-UH)*. sDNA-UH has been developed for the assembly constituency of Caerphilly, South Wales enabling operationalization of the spatial elements of the proposed urban health niche. State-of-the-art spatial and network analysis techniques have been employed upon the UK Ordnance Survey Mastermap data layers to quantify the various facets of urban built environment in the form of built environment morphological metrics (morphometrics) with the potential to influence individual's health.

Based on the developed sDNA-UH, a series of three empirical studies comprising multilevel cross-sectional and longitudinal models have been presented which examine the association between specific attributes of a built environment and health outcomes. Firstly, a two-part multi-level regression model was employed to examine the impact of built environment configuration upon psychological distress. Land use mix, density of amenities, local street-network general accessibility ('betweenness') and slope variability were identified as significant predictors. Secondly, the first long-term longitudinal evidence relating

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the built environment to change in obesity in older people identified land use mix, density of amenities street network accessibility and slope variability as significant predictors. The third study examined the health effects of differential accessibility of an individual's dwelling with respect to multiple service and facility catchments at multiple spatial scales. Dwelling level density, dwelling type, density of community services, street network movement potential expressed in terms of betweenness index as well as neighbourhood-level deprivation were identified as the significant parameters. The study reported significant differences in point estimates and level of significance when comparing the two spatial scales of 0.5 and 1.0 mile street network catchments.

The empirical evidence thus generated lends support to the thesis' principal hypothesis that the built environment influences individual health behaviour and eventually health. The research concludes that optimized design and planning of urban built environments act as effective public health intervention in our goal of health-sustaining communities and a healthy city.

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## List of Abbreviations

ACES	Active Community Environments
ASA	Angular Segment Analysis
BE	Built Environment
BMI	Body Mass Index
CaPS	Caerphilly Prospective Study
CCD	Census Collection District
CAS	Complex Adaptive Systems
DALYs	Disability-adjusted Life-years
DHAs	District Health Authorities
ETS	Environmental Tobacco Smoke
FAR	Floor Area Ratio
GHQ	General Health Questionnaire
GIS	Geographic Information System
GLLAMM	Generalized Linear Latent And Mixed Models
GP	General Practitioner
HADS	Hospital Anxiety and Depression Scale
HIV	Human Immunodeficiency Virus
ICSU	International Council for Science
IHD	Ischaemic Heart Disease
ITN	Integrated Transportation Network
LSOAs	Lower Super Output Areas
METS	Metabolic Syndrome
MI	Myocardial Infarction
MSOA	Middle Super Output Area

MVPA	Moderate-to-Vigorous Physical Activity
NDVI	Normalized Difference Vegetation Index
NHS	National Health Service
NICE	National Institute of Health and Clinical Excellence
OPCS	Office of Population Censuses and Surveys
OSM	Ordnance Survey Mastermap
PERI	Psychiatric Epidemiological Research Instrument
REAT	Residential Environment Assessment Tool
SAD	Seasonal Affective Disorder
SD	Standard Deviation
SES	Socio Economic Status
sDNA	spatial Design Network Analysis
sDNA-UH	spatial Design Network Analysis for Urban Health
SofC	Sense of Community
SOV	Single-Occupant Vehicles
SVOCs	Semi-Volatile Organic Compounds
TAZs	Traffic Analysis Zones
USEPA	US Environmental Protection Agency
VIFs	Variance Inflation Factors
VOCs	Volatile Organic Compounds
WHO	World Health Organization
WIMD	Welsh Index of Multiple Deprivation

## Chapter 1: Introduction

For in general you will find assimilated to the nature of the land both the physique and the characteristics of the inhabitants (Hippocrates 1948: 137).

The first decade of the 21<sup>st</sup> century was for British urban planning, something of a re-run of the first decade of the 20<sup>th</sup> century: planning was heralded as a powerful new antidote to urban public health problems. A hundred years ago, the cause was the abysmal conditions in cities that had emerged by the middle of the 19<sup>th</sup> century and the consequent successive waves of public health-related legislation that eventually gave rise to the modern British planning system at the dawn of the new century. This time around, it was an epidemic in obesity allied with growing concerns over the health outcomes of unequal cities, marginalized groups and problem neighbourhoods and a shift in perspective amongst epidemiologists that favoured a holistic view of health, health problems and interventions and led them to view urban planning as the ultimate public health intervention

Understanding the urban factors that are risk or protective factors for health can capitalize on the positive aspects of urban living and lead to the development of appropriate interventions and preventive measures. Given the growing predominance of the urban living, interventions that take into account features of the urban environment have the potential to be widely applicable and to influence the health of vast number of people. (Vlahov and Galea, 2003).

In the United Kingdom, the relationship between urban planning and public health came under the spotlight of medical scientists and planning and academics (Barton and Tsourou, 2000, Kidd, 2007, Barton, 2009, Herrick, 2009,

Townshend and Lake, 2009, Evans et al., 2012); public health and planning policy makers (National Heart Forum., 2007, NICE., 2008, Department of Health., 2008, RTPI., 2009). Britain is not alone in this: the same connections are being made across Europe, Australia, New Zealand (National Heart Foundation of Australia., 2004, Public Health Advisory Committee., 2008, Healthy Spaces and Places., 2009, WHO-Europe., 2010), and USA (Greenberg et al., 1994, Frank et al., 2003, Diez Roux, 2001, Diez Roux, 2002, Dannenberg et al., 2003, Sallis et al., 2012, Corburn, 2004). The developed world has been rediscovering one of the forgotten fundamental purposes of city planning. The modern scholarship picks up from that of the early pioneering ecological health studies aimed at deciphering the disparities in health and mortality. The earliest studies were conducted in the 17th century; John Graunt reported on the social distribution of death from plague in London, while William Petty enumerated the costs of mortality (Graunt, 1939, Petty and Hull, 1899). Towards the late 19th century (1886-1891), Charles Booth, a social reformer conducted a detailed survey to measure and map the incidence and causes of poverty in inner London which formed the basis of the contemporary Registrar General's social class scheme (Booth, 1889).

The relationship between health and urban development pattern has not had to be rediscovered in countries at a less advanced stage of economic and urban development. Cities in developing countries, as with European cities 150 years ago, have always been intrinsically unhealthy. The proportion of urban population increased from slightly below 20% to 36% over the period between 1960-2000 in both Asia and Africa (Bloom et al., 2008). Increasing competition for space in the cities results in socio-spatial stratifications wherein the residents of the poorer neighbourhoods typically experience inadequate housing, sanitation, lack of access to potable water, overcrowding, pollution, substance use, crime and the

associated health costs. Induced behavioural changes result in sedentary lifestyles manifested by physical inactivity, psychosocial stress, increased dependence on junk or otherwise poor quality food and tobacco use; potential precursors for chronic non-communicable diseases. For example, the estimated mortality from cardiovascular disease in 1990 was 70% higher in the developing nations (at 8-9 million fatalities) relative to developed nations at 5.3 million deaths over the same period (Lopez, 1993). A recent study found observed comparably higher incidence rates of hypertension in the urban areas of India and sub-Saharan Africa than in the rural areas (Srinath Reddy et al., 2005, Addo et al., 2007). Another study conducted in China indicates that the propensity to report poor health increases with increasing degree of urbanization. Incidence rates of obesity and hypertension were also comparatively higher in urban populations than their rural counterparts (Van De Poel et al., 2012). Another longitudinal study conducted in eight provinces of China reported a 14% increase in car ownership between 1989-97 and an associated 1.8-kg greater weight gain, while the likelihood of their becoming obese during that time period doubled (Bell et al., 2002, Hu, 2011). The world's slum population is increasing despite the rapid progress in urban environmental quality made in some parts of the developing world. The population of slum dwellers has risen from 0.75 billion in 1990 to 1 billion today and this has been projected to further rise to 1.4 billion by 2020 (Lopez Moreno and Warah, 2006). The ubiquitous slums and informal settlement problem that accompany rapid urban and economic development have usually helped keep sanitation and health improvement a fundamental objective of urban planning in such countries. Even in China, where there are no informal squatter settlements, the wholesale redevelopment of the so called 'villages in the city' is driven in part by public health concerns and exactly mirrors the slum removal and city beautification and modernization movement of early and mid 20<sup>th</sup> century Europe (Wu, He and Webster 2010).

The ongoing link between built environment and health in developed countries and the rediscovery of the same in developing countries is a challenge for urban planners, non the least, because they have spent very little time during the last hundred years of developing their craft, developing a parallel science of healthy cities. This is especially so of planning in the west. Most urban planning scholarship in the universities has very little to do with empirically testing the relationship between built form parameters (referred to as urban *morphometrics* in this thesis) and urban performance parameters such as health outcomes. That is something that is thankfully beginning to be redressed and one of the aims of this thesis is to review progress to date and point the way forward in particular directions. First, however, I place the problem in a broader context of a simple model of urban costs and benefits in order to make the point that urban public health is something that should be optimized, not necessarily maximized.

Cities exist as a result of individuals co-locating in pursuit of wealth and welfare. They form and grow because of the economies of agglomeration. For firms, labour is cheaper in cities than in dispersed locations, as are the specialized inputs needed to make things and deliver services. For individuals, consuming is cheaper in cities because of economies in scale in consumption, producing better education and better health care, for example. Competition among consumers make cities more innovative than dispersed locations as producers of services and goods have to be creative in meeting people's needs and wants in order to stay in business. Competition among producers of goods and services keep prices lower in cities than in small settlements. The advantages of living in cities over living in dispersed locations are also advantages of living in larger cities over smaller cities. Choice and price of inputs, products and services are all improved, in principle, as the number of individuals and firms clustering together in ever greater concentration rises. Economics drives urban growth and as an urban

economy deepens, so does the division of labour as people are able to develop more and more specialized skills (Webster and Lai, 2003). They invest in their own skills in pursuit of a labour premium but can only do this as far as they find ways of meeting the demands of other individuals for ever more specialized goods and services. This virtuous deepening and diversification of human interaction is the blessing of the city. The city also has its curse, however. The curse of the city is the congestions (crowding) costs that set in at certain points as population density increases. Figure 1 is a classical model (after William Alonso, Vernon Henderson and others) that hypothesizes the relationship of costs and benefits of agglomeration as a city grows in size. The average benefits (costs) of city living are the total benefits (costs) divided by the number of people and could be measured empirically in a number of ways.



Figure 1.1. Urban efficiency and city size.

Notes: P1 = minimum city size, P2 = lowest cost city size, P3 = city size giving maximum welfare to existing citizens, P4 = optimal city size, AB = average net benefits, AC = average costs

Source: Derived from Alonso (1971), Richardson (1978), reproduced from Webster and Lai (2003).

Up to P3, the average benefits of living in the city continue to rise. After P3, each additional person has the effect of reducing the average benefits because crowding has set in. Hospitals, clinics, GP practices, primary and secondary schools at some stage all get congested, like the roads that carry people to such services and enable people to live apart from their work place. Investment in additional health care services and facilities, schools and roads moves P3 to the right, but for any fixed stock of services and physical infrastructure, it is reasonable to suppose that an inflection point is reached after which average benefits decline. Once a city is built, the cost of renewing and expanding infrastructure is a function of land price which is itself a function of demand and therefore population and population density so it becomes problematic to reinvest to avert the inflection point. All cities have their own demise built into their DNA. Set against the benefits curve in the Figure is a cost curve - the cost of supplying urban infrastructure and services divided by the number of people sharing the costs. Up to P2, cost per person falls as the cost of a fixed stock of infrastructure is shared by more people. At some stage, however, the average costs rise as it becomes increasingly more expensive to purchase land, build facilities, manage them, diversify them, and innovate to meet increasingly demanding expectations and so on. P3 is the optimal city size from the point of view of those who live in the city: the point of maximum distance between benefits and costs. It is the NIMBY size so vigorously pursued by so many local authorities in the South East of England, for example. P4 is the socially optimal city size from the point of view of society as a whole: it has accommodated P4-P3 additional people all of whom experience net benefits. Beyond P4, the costs exceed the benefits. Rational people would not move to this city and a rational and all powerful government would stop a city at this size and start another one. A more enlightened rational and powerful government might insist that all cities stop at P3. Many cities in the world have clearly exceeded P4. Migrants keep

flocking to them, however, because of the future value they place on urban life the jobs they expect to get and the education and jobs they expect for their children. In the most crowded and extensive cities of the world, the health costs feature as very significant part of the diseconomy of urban life beyond P4. The costs and benefits of size are unevenly distributed to a city's population spatially and socially. The urban sprawl together and associated real estate developments in the mega-cities of the developing world create two contrasting configurations: the peripheral regions typically characterized by informal settlements lacking basic infrastructure and public services, with the sub-urban sprawl also accommodating the creation of mixed residential zones for high and middle income groups co-existing with high priced commercial and retail complexes. Such spatial disparity in wealth and quality of life aggravates socio-economic segregation and health inequity with significant health costs (Frumkin, 2002, Frumkin et al., 2004). According to recent estimates for the year 2010, the urban agglomerations of Karachi (13.052 million), Cairo (10.534 million), Kolkata (15.577 million), Mumbai (20.072 million), and Metro Manila (11.662 million) have the highest population densities per square kilometre (UN - HABITAT., 2010). They could well be out of control primate cities with no hope of servicing their populations adequately. They illustrate the power of hope governing mass ruralurban migration and the reality of hope-deferred or lost as the net real benefits of urban living remain static or are squeezed beyond P4 in the Figure, further towards parity with rural subsistence living (the ultimate alternative and opportunity cost facing the urban poor) or worse (since the transaction costs of relocating are high for most urban poor families and they are therefore, to a degree, trapped).

What, then, may be said about public health and urban planning on the basis of this simple but profound and resilient model?

First, at low levels of per capita investment in urban physical and social infrastructure, health risks soon surface as a limiting constraint to the benefits of urban agglomeration. This is where London was at the end of the 19<sup>th</sup> century and modern cities in less developed countries have been during the last 50 years or so of massive urbanization. Cities in developing countries typically find it difficult to raise sufficient tax revenues to provide for the health standards that the west has become accustomed to.

Second, the West also finds it difficult to sustain the standards it has become accustomed to. Due to rising labour costs, rising costs of medical technology and the high costs of organizing health care supply, for example, the cost of sustaining a city at P4 are probably on the increase (AC moves upwards). This leads to the intriguing hypothesis that rising health care costs imply the need for smaller cities. This is because higher health care costs that do not raise the benefits of urban living commensurately, raise the general costs of supporting an urban population and the higher the general costs the lower the population that can be efficiently accommodated for a given set of agglomeration benefits. It should be noted in this respect that despite the huge inflow of public funds into the British National Health Service over the last decade (NHS expenditure increased by 70% from £60 billion to £102 billion), total UK NHS productivity has gone down by an average of 0.2% per year over the period 2000-01 and 2010-11. Over the same period, productivity in hospitals fell by 1.4% per year (Comptroller and Auditor General., 2010). The scientific relationship between health, health-care costs and settlement size is a very under-researched issue.

Third, investments in health care technology (as opposed to labour-related and other unproductive cost inflation) raise the benefits of living in cities (moving AB upwards in Figure 1). Access to specialized health and hospital services and the latest medical technology are classical agglomeration benefits represented by the

AB curve. They are found in cities because of economies of consumption and production: larger concentrations of people create demand for more costly and more diverse services and equipment, which can be provided in cities at a cheaper unit price.

Fourth, a long standing and widespread urban planning doctrine (not a scientific principle) is to design cities at the neighbourhood scale around core services, especially primary schools but also primary health care such as General Practitioner surgeries and clinics. Physical layouts of new urban development in many cities across the world are planned under certain assumptions about the numbers of homes and people efficiently clustered around a set of core neighbourhood services. One definition of a healthy city (in the sense of being well provided with health care facilities) is one in which health care services and facilities are organized in size and location in a way that optimizes their effectiveness. If the horizontal axis of Figure 1 is re-interpreted as being the population co-consuming a given health service/facility, then P4 is the optimal population catchment. If there are many such services in a city or region, then one of the tasks of urban planners working with health care planners is to coordinate with each other to ensure an optimal allocation of services across the population: something that inevitable leads to a hierarchy or services with local services nested within the catchment of services that require a larger threshold for efficient provision. This is never a perfectly efficient process however since health care facilities are lumpy and the services provided within them inevitable either over or more likely under-supply the urban population which is never exactly equal to the break-even threshold of the bundle of services provided at a facility. It may be noted that market-like institutions introduced into public health organizations over recent decades can improve the efficiency of the spatial health economy. If health care buyers representing patients in one city can buy services

supplied in another and patients assume some of the costs of being mobile customers, then there need not be such a closely matched or tightly designed configuration of health services and population and the intrinsic inefficiencies of inevitably lumpy health facility planning can be mitigated.

Fifth, and most important for the focus of this thesis, health problems are part of the cause of the benefits inflection in Figure 1. Some health problems are directly caused by crowding. Respiratory problems, stress and mental illness can be caused or exacerbated by living near or using overcrowded roads for example (Babisch et al., 1990, Babisch et al., 1999, Oftedal et al., 2003, Pujades-Rodríguez et al., 2009, Nordling et al., 2008). Mental health problems result from congestion in the labour and housing market. High density living is associated with diseases related to dampness, air-borne pollution, exposure to industrial waste-borne toxins and so on (Ginns and Gatrell, 1996, Elliott et al., 1999, Gomez-Jacinto and Hombrados-Mendieta, 2002).

This brings me to the main focus of the thesis: investigating the relationship between urban design (built environmental configuration or urban morphology) and health. Chapter 4 reviews this relationship at a fine level of detail. The aim is to offer a definitive review at this point of time, which tries to capture all that is currently known of any significance, about the relationship (Chapter 4).

I preface the scientific review in Chapter 4 with the observation that there seems to be a widespread intuitive belief that the design of the built environment has an effect on health outcomes. It is not surprising that urban planners have readily accepted this, since it bolsters their professional justification. That the epidemiological and medical practitioner community has accepted the belief, is more significant in the sense that these professions have nothing to gain and possibly something to lose by admitting the built environment into the lexicon of

their associative and causal models and intervention mechanisms. The relationship is an intuitive one: it is plausible and makes sufficient common sense for journalists to rally to the cause. The scientific basis for this belief is controvertible however. Urban planners tend to work by doctrine, not by science. The objective of the thesis and publications arising from it is to lay the science before the planning community and propose theoretical and empirical models that will help establish an empirical evidence-base for healthy city planning. At most, there is a weak relationship between urban morphology and health outcomes. Weak relationships are important nevertheless. They can still guide our urban designs as well as policies. What we should be doing is to try and measure them more accurately so that we can progressively build up a knowledge base about healthy city attributes and performances.

To this end, the thesis introduces an approach to measuring morphometrics that goes beyond any other study yet published in terms of level of spatial detail and matching of this to individual health records. My PhD project has involved designing and developing what I am calling the <u>spatial Design Network Analysis</u> for <u>Urban Health</u> (sDNA-UH), a high resolution GIS database comprising a series of Built Environment (BE) morphological metrics (morphometrics) coupled with socio-demographic, lifestyle and health variables for the assembly constituency of Caerphilly, South Wales, UK (83,600 inhabitants over 114.54 sq km with a density of 727 inhabitants/ km<sup>2</sup>). The UK Ordnance Survey Mastermap (OSM) data layers; the topographic layer, integrated transportation network layer (ITN) and address layer 2 of Caerphilly were employed as the base data sources for the built environment and a robust set of morphometrics were measured at the dwelling level as well as within specified street network buffers around an individual respondent's dwelling unit. GIS based spatial analysis and network models have been employed to construct more than 100 objectively measured

BE morphometrics, broadly categorized under dwelling level, land use, street network accessibility, physical environment and area level deprivation variables; and thereafter brought together with individual socio-demographic and health data from a long-established panel study of elderly men to test the effects of the built environment on individual health at multiple spatial scales.

Chapter 2 traces the origins of public health and city planning and describes dynamic paradigms of epidemiology as the definition of health has evolved in response to the pressures of urbanization processes and the changing disease etiology. It concludes by highlighting the contemporary impetus towards a paradigm that is holistic and multidisciplinary, giving due credence to both biomedical as well as contextual (social, built and natural environmental) determinants of health. Drawing from the diverse strands of research evidence, I introduce the concept of the spatial *health niche* as the fundamental public health planning paradigm in Chapter 3. Such a framework essentially endeavours to integrate four key elements: (i) the multiple spatial scales at which the various health defining processes function, ii) levels of organization for studying health from the individual to the population level, (iii) the health promoting/inhibiting attributes of space; and (iv) temporal dynamism. Given the complexity of the notion of healthy city, I employ the concept of urban health niche to conceptualize a bottom-up model that incorporates and integrates the multiple, multiple level health determinants existing at the different spatial hierarchies in a city system. Chapter 4 provides a systematic review of the epidemiologic, public health and health geography literature on built environment and health following the structure created by the proposed spatially explicit urban health niche model. Determinants of health are therefore discussed in detail at the housing, neighbourhood and city levels. Chapter 5 discusses the methodology involved in the development of the spatial Design Network Analysis for Urban Health (sDNA-

*UH)* and its component morphometrics. *State-of-the-art* spatial and network analysis techniques are employed to quantify various facets of the urban environment that have the potential to influence individual's health. Illustrating the evidence-based approach to healthy city planning advocated in this thesis, Chapters 6-8 discusses a series of epidemiological models that attempts to measure the degree of association between various parameterized features of the built environment and various health outcomes, specifically, obesity and mental health outcomes. The thesis is wrapped up with the conclusion in the form of Chapter 9.

# Chapter 2: Tracing the ever-evolving relationship between urban planning and public health

#### 2.1 Introduction

The advent of urbanization and associated problems endemic to it led to the evolution of the disciplines of public health and town planning. Although emerging from a common necessity to cope with the demands of urbanization and the resulting health issues, over the course of the past two hundred years the relationship between the two disciplines has *waxed and waned*. Earlier, good health of an individual had been simply synonymous with the non-existence of any identifiable serious disease; while, a nation's health was reflected solely by measures such as infant mortality, mortality of middle-aged persons, prevalence of infectious diseases like tuberculosis, malnutrition in infants and expecting mothers, incidences of epidemic outbreaks, and so on. The multi-fold increases in population in Britain from the early/mid 19<sup>th</sup> century and the West more generally over the next 100 years, and the ensuing accelerated urban expansion have been accompanied by increasing complexity of the urban health issues.

As the etiology of the disease shifted from *infectious to chronic*, the notion of health no longer remained intrinsically synonymous with the existence/non-existence of disease(s). It shifted away from the original uni-dimensional disease-focused model and the more holistic model comprising dimensions of analysis, diagnosis and prescription in the form of well being, quality of life and the so called positive health agenda. The counter-productiveness of following a purely *unidirectional (biomedical)* thinking has been eloquently summarized by Tinetti & Fried in the *American Journal of Medicine:* 

The changed spectrum of health conditions, the complex interplay of biological and non-biological factors, the aging population, and the inter-individual variability in health priorities render medical care that is centred primarily on the diagnosis and treatment of individual diseases at best out of date and at worst harmful (Tinetti and Fried, 2004).

This was anticipated in the more comprehensive definition of health proposed by the WHO in 1948, wherein:

Health is a state of complete physical, mental and social well-being and not merely the absence of disease or infirmity. The enjoyment of the highest attainable standard of health is one of the fundamental rights of every human being without distinction of race, religion, political belief, economic or social condition (WHO., 2005a).

Nonetheless, the onslaughts of subsequent changes in demography as well as patterns of illness accompanying rapid urbanization has meant that the definition has often been unproductive and counter-productive in many cases (Huber et al., 2011). The French physician Georges Canguilhem in his book *The Normal and the Pathological* (1943) introduced the notion of health as an individual's ability to adapt and self manage. This was a much more realistic formalism as health depends on an individual's circumstances and includes both animate and inanimate environments in addition to physical, mental, and social dimensions of human life (Editorial., 2009). More recently, health has been parameterized in terms of frailty in an ageing population (Rockwood et al., 2005, Jones et al., 2004). Others have associated health with the idea of human rights (Susser, 1993) and justice, demanding the ability to live a life of value (Sen, 2009). At the same time, the near *impossibility* of defining health on account of its multi-dimensional nature has been highlighted by several authors (Paine, 2005, Jadad and O'Grady, 2008).

In this chapter, I trace the prewar and post war origins of public health and urban planning movements highlighting the ever-evolving epidemiological paradigms in order to cater to the increasing challenges of urban health. The Chapter concludes by highlighting a current resurgence of the uniting links between the disciplines of public health and urban planning and a thrust towards a more holistic approach in public health planning.

# 2.2 The pre-war era: Tracing the ever evolving relationship between planning and urban health

A brief look back at the epidemiological records of the past indicates that the cities of medieval and early modern Europe were regarded as *unhealthy places,* consistently characterized by higher rates of mortality than the adjoining rural areas. This has been clearly illustrated by Bairoch (1988) who concluded:

"By the beginning of the nineteenth century, the urban death rate was distinctly higher than that recorded in rural districts - as was also the case with infant mortality, which of course contributed to the overall pattern. The difference between urban and rural mortality, large at the start of the nineteenth century, gradually decreased until it vanished during the first years of the twentieth century. The average difference, which around 1810-1830 seems to have been on the order of 40-60%, fell to around 10-30% by about 1890. From the start of the twentieth century, the difference disappeared altogether or had even reversed its direction." (pg. 233-234).

The term *urban penalty or le handicap urbain* was employed to highlight the comparatively higher rates of mortality in the cities than the rural areas. The twin processes of industrialization and urbanization resulted in overcrowding, pollution, and lack of sanitation and the corresponding increased burden of communicable diseases especially tuberculosis (Kearns, 1988, Woods, 2003,

Harpham, 2009). As an example, between the period 1862 and 1880, the crude death rates in towns of imperial Germany (erstwhile Prussia), were on an average a staggering 10% higher than the rural average (Vögele, 2000). The pattern was no less different in most 19<sup>th</sup> century British cities as the urban population increased steadily 25% to 66% (Szreter and Mooney, 1998). Life expectancy at birth in England and Wales remained low at 40-41 years over the first half of the 19<sup>th</sup> century, while a slight increase of 6 years was observed in the second half (Wrigley et al., 1997). In 1861, the life expectancy at birth for a male was only 26 years in Liverpool, in contrast to the much higher 57 years for a baby born in the rural Okehampton, Devon (Woods and Woodward, 1984).

The first quarter of the 19<sup>th</sup> century witnessed the emergence of the sanitary movement and the evolution of *miasma* as the predominant theory to cope with the urban health challenge. The rapid urbanization was identified as the root cause as has been eloquently highlighted by Wrigley (1969):

"It is perhaps more accurate to say that high mortality was caused by urbanization rather than by industrialization. It was in the bigger cities that mortality was so very high. Most of these big cities were not heavily engaged in the new industries, but were administrative and commercial centres. Paris, Berlin, Marseilles, and Liverpool all had high death rates and low expectation of life, though none was a typical product of the industrial revolution in the narrow sense. In a broader sense, of course, all were able to develop only because of the improvements in transport and growth in productive capacity which characterize the industrial revolution. To a notable extent, but now in a different context, mortality was still density-dependent. Wherever there were large cities there were slum areas with very high densities of population and severe overcrowding which allowed diseases like tuberculosis to spread very

widely and exposed children and young people to a great range of infectious illness." (Reproduced from Bairoch (1988), pg. 236).

Thus foul pollutants emanating from the physical environment (air, water and soil) as well as overcrowding were believed to be the main causes of mortality and morbidity. Overall data on sickness and death were collected from the unhygienic inner-cities of Europe to study the emergent spatial patterns. Special importance was laid on ecological mapping of overall mortality and morbidity, rather than on the causality and attributes of specific ailments. Mortality was mapped in relation to specific diseases, housing conditions, industries and occupations. The English Births and Deaths Registration Act was passed in 1836 and the Registrar General's Office was subsequently set up. William Farr, as the head of the statistical department in the English Registrar General's Office introduced in 1839 the diagnostic classifications for national mortality statistics. His pioneering contributions to vital statistics provided much required direction to the efforts of sanitary reformers. His studies on cholera in London identified significant districtlevel variations in mortality with respect to housing quality, air quality and residential elevation above the sea level (Farr, 1885). This period also witnessed significant metamorphosis of the social fabric of England as it made transition from agricultural to an industrial economy. The Reforms Bill of 1832 and the Municipal Corporation Act of 1835 were important developments that eventually led to social reforms aimed at improving health. Edwin Chadwick spearheaded the social medicine movement and led the Commission of Inquiry in to the working of poor laws that resulted in the Poor Law Amendment Act, 1834. He emphasized the significant social value of public housing and improved sanitation in the neighbourhoods, especially as a means to eradicate poverty. In one of the most extensive reports of the epoch he stressed that the contextual health inequalities originated from the physical environmental factors resulted in poverty

and deprivation (Chadwick, 1842). Subsequently, Friedrich Engels studied the health of the factory workers of Manchester in 1844 and reported twice the mortality rate among the workers living in poor housing than those in well off housing conditions. He reversed Chadwick's causality arguing that poverty resulted in disease (Engels, 1987). John Snow conducted extensive ecological analysis of the geographical distribution of cholera in London. He was able to map the spatial distribution of deaths from cholera in Broad Street district of London where more than 500 mortalities were recorded within just ten days of September 1854 (Snow, 1936). He termed his map the "cholera field," its centre was a pump in Broad Street near Golden Square, while the "field" was bounded by four streets; Great Marlborough Street, Dean Street, Brewer Street and King Street. This remains to this date a classic study in the domain of geographical epidemiology.

During this era, the professions of city planning and public health functioned in unison both in Europe and America to produce initiatives that were mostly preventive in nature. These included closure of open drainage and sewer systems, systemized waste disposal, public baths employed to inhibit contamination as well as public housing and designed parks and playgrounds to *contain the miasma* (Duffy, 1990). These were to some extent successful in bringing about major improvements in health and hygiene, especially in the control of leprosy and small pox. Nonetheless, social epidemiology was more oriented to the understanding of causes and prevention of disease at the population levels rather than targeting the real biological agents responsible.

The second part of the nineteenth century witnessed the evolution of germ theory as a predominant paradigm in public health. Jacob Henle, 1840 was in all probability the first to articulate the pathogenic cause of contagious diseases, associating miasma with contagion. In the first chapter of his treatise entitled

Pathologische Untersuchingen, he classified contagious diseases in to two groups, epidemic and endemic. He further classified them into three sub-groups, diseases caused by miasmas, miasmatic contagious diseases, and pure contagion. He argued that the propagation of the latter two was a result of contagium animatum, a substance excreted by the diseased organism, which on transmission to a healthy organism has the capacity to multiply and produce the same disease (Henle and translated by Rosen, 1938). Almost thirteen years later, John Snow published a paper entitled, On Continuous Molecular Changes, More Particular in Their Relation to Epidemic Diseases, which elaborated a similar hypothesis about the causes of contagious diseases. Based on his observations of the cholera epidemic, he concluded that infections commenced in the alimentary canal subsequent to the ingestion of contaminated water. He subtly emphasized the implicit role of microbial agents and metabolic processes (coined as continuous molecular changes) in the infection, multiplication and propagation of communicable diseases (Snow, 1936, Winkelstein Jr, 1995). This period constituted a transitional phase, heralding the new era of infectious disease epidemiology accompanying the novel advances in microbiology of the time. Almost a quarter century after Henle's first proposition, Louis Pasteur in 1865 demonstrated the role of living organisms in the causation of epidemics in silkworms (Vallery-Radot and Devonshire, 1901). The ensuing rapid advances in microbiological research over the subsequent decades eventually usurped the position of the miasma theory as the dominant paradigm and ushered in the era of Germ theory. The 1870's were associated with the isolation of pathogenic agents responsible for leprosy and anthrax; and over the 1880s the germs for typhoid, tuberculosis, cholera, diphtheria and meningococcal meningitis were identified; and those for plague and malaria during the 1890s. The period of medical discovery driven by the microbial paradigm was an equivalent one to the present one emanating from the genetic paradigm.
The principle tenets of the germ theory were based on Robert Koch's postulates which hypothesized that a single pathogenic germ was invariably associated with a specific disease (Evans, 1976). Diagnosis and treatment involved identification of the microorganisms, their isolation and culture from the disease sites, experimental inoculation and reproduction of lesions. The overall strategy was *germ* centric aimed at minimizing the spread through vaccination and isolation of the affected and eventual clinical treatment through antibiotics and chemotherapy.

The enhanced co-operations between the disciplines of planning and public health and the population based preventive interventions of the sanitary age were reoriented to laboratory based bacteriology, often manifested through individual clinical interventions such as vaccinations and doses of antibiotics for epidemic control and cure (Duhl and Sanchez, 1999).

Despite its accurate causal explanations of several infectious diseases, germ theory held a mono-etiological model of causation of infectious diseases with focus exclusively on the attributes of pathogenic agents (Stewart, 1968). It failed to explain why some individuals were more susceptible to a particular illness while others were not (also termed as the doctrine of specific etiology). Interpretations of diseases implicitly based on the etiology of infection proved to be a logical fallacy as it failed to take in to consideration the other equally important co-determinants, especially, age, sex, genetic predispositions, behavioural factors, nutritional factors, social and hygienic factors etc. Thus, germ theory had no causal hypothesis for prevalent non-pathogenic disease, especially those arising from nutritional deficiencies and occupational exposures. Furthermore, it failed to provide suitable interpretation of complex causality, especially when infections caused by pathogens remain in a latent state until

some physiological or environmental factors act as triggers, thereby activating its pathogenicity.

Towards the beginning of the 20<sup>th</sup> century, considerable transformations in economic and social landscape accompanied the advancing industrialization and urban expansions. It was during this era that city planning and design eventually established itself as a more formal discipline striving to overcome the negative health impacts of the Victorian industrial city characterized by urban sprawl and pollution. Between the periods of 1870-1914, most British cities had acquired some form of public transport system. They were initially in the form of horse tram and buses which were subsequently replaced by motor buses and electric trams. London even had electrified suburban lines as early 1905-1909. This had significant consequences with respect to the dynamics of urbanization. The areal extent of the city was virtually fixed as the population doubled between 1800 and 1851; however the city began to expand in all directions post-1850 as the railway networks grew, manifested by its initial and abiding dendritic form. However, with the evolution of more accelerated public transport system in the form of electric trains, by 1939, London began to experience a more uniform growth, so that its form had by time attained an almost circular shape, 12-15 miles in radius. Similar urban patterns of expansion were observed in other major cities of Europe. Such rapid urbanization came with severe public health consequences, especially negative effects originating from high density, overcrowding, unhygienic living conditions and poor quality of the environment. The term *smog* was coined by a Londoner in 1905 to describe the hazardous combination of fog and smoke from industries and traffic. In fact, Londoners have been periodically prone to detrimental health effects of smog events, also called *pea soupers*, eventually culminating in the Great Smog of 1952 which was responsible for approximately 12,000 mortalities (Bell et al., 2004).

In the US, the phenomenon of urban expansion occurred via the twin processes of annexation and consolidation. During the annexation phase, the city expanded by adding unincorporated land while consolidation was accompanied by the institutional merger of adjoining government municipalities (Frank et al., 2003). Major waves of annexation and consolidation had occurred in Philadelphia (1854), St. Louis (1856), Chicago (1889), New York (1898) and Detroit (1880-1918). The boom in car usage and cheap electricity resulted in two simultaneous processes. On the one hand, there was increased mechanization and lesser dependence on human labour resulting in a marked decline in the farm population from 32% in 1900 to 23% in 1940 and almost 3% in 1980. On the other hand, many planners including Frank Lloyd Wright advocated reduced dependence on the urban centres and increased dispersion of both homes and jobs. Wright proposed a dispersed planning approach characterized by low density urban spread, also called the *broadacre city* wherein he conceptualized each home to be surrounded by an acre of agricultural land and connected to mass transit system (Wright, 1935). The peripheral regions of the urban centres became the areas of targeted growth, expanding at a rate almost twice than that of the urban core in 96 largest US cities over the decade encompassing 1920 to 1930 (Jackson, 1985). The offshoot of such a policy saw the emergence of low density suburban form characterized by less expensive properties built on larger plots with comparatively lower land-use diversity, job density as well as street level accessibility (Heimlich and Anderson, 2001, Frumkin et al., 2004). Thus in contrast to European cities, the process of urban expansion in the US occurred at a larger scale (in terms of land area), manifested by what is technically termed urban sprawl. Such a dispersed growth has subsequently been found to be associated with reduced sense of place and corresponding negative health implication (Ewing et al., 2003a).

This period witnessed a multi-fold increase in the national wealth of Great Britain, United States and most Western European countries. Nonetheless, gross inequality in the distribution of wealth became more pronounced. Unemployment and poverty in the sprawling urban communities resulted in the emergence of labour and social ideologies, partly triggered by significant disparities in the health, housing and social conditions that were prevalent. Although the microbiological paradigm dominated research, the sociological paradigm continued to survive, with a marked degree of re-orientation of the public health and planning strategy somewhat along the lines of the social reformers of the sanitary movement. Specific importance was associated with the problem of urban areas with emphasis on housing which promoted clean, sanitary and healthy living. With the objective of overcoming the ills inherent in a typical Victorian industrial city, James Buckingham, the social reformer and architect proposed the design for the model town of Victoria. The design comprised a series of concentric squares with industry separated from housing and a green belt buffer of 4000 hectares of agricultural land. He proposed relocating the polluting industries to the outskirts of the city with the workshops at the centre and houses on the periphery of the land. In another seminal work, Tomorrow - A Peaceful Path to Social Reform (re-issued as Garden Cities of Tomorrow in 1902), Ebenezer Howard propounded the idea of Town Country or Garden City in response to the suburbanization and building boom. Such a DNA of urban growth would efficiently combine the benefits of town by way of improved accessibility, organization and financing, with the benefits of country life in a cleaner and altogether more orderly environment. He proposed decentralization of the workers and their work places with a view to transferring the benefits of urban agglomeration to the new settlements, thereby providing them with higher purchasing power and more regular employment (Osborn and Whittick, 1977). In the UK, one of the planning measures employed to negate the effects of urban

sprawl was to re-house thousands of slum dweller and factory workers to subsidized single family public housing, generally 4-5 miles from the city centre. One classic offshoot of this planning experiment, with due considerations to public health concerns was the town of Bournville built by the Cadbury brothers in 1894. In their experiment to create a self-sustaining industrial town, the Cadbury brothers transferred their factory from Birmingham city centre to a green field site on the outskirts of the city. Intricate attention was paid to house design, provision for suitably sized gardens, landscaped roads, parks and recreational grounds with a view to alleviate the living conditions of the factory workers. Another successful experiment was Port Sunlight in north west England, built by the Lever brothers in 1888, again with the aim of balancing industrial production with a model housing development for workers accompanied with social amenities and facilities (Unilever, 1976).

The focus had shifted towards devising effective thresholds for the net density of residential areas, creating green belts as buffers around new communities, all-inclusive and aesthetically pleasing urban designs and master plans as well as zoning of land uses (Hall, 1975, Peterson, 2003). Howard's concepts of the garden city and social integration were first brought to fruition by architects Raymond Unwin and Barry Parker with the design of Letchworth (with a population of 35,000 people) as well as Welwyn Garden City (with a population of 10,000) both in the ex-urban countryside of Hertfordshire, neighbouring county to London. Another classic achievement of this age was the preparation of the New York Regional Plan of the 1920s, wherein Clarence Perry introduced the revolutionary idea of dividing the city into distinct *neighbourhood units* or socially engineered spaces encompassing the existing catchment area of community facilities such as schools and shops (Perry, 1929a, Perry, 1929b). These were to be structurally contiguous basic spatial units characterized by a pronounced

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sense of belonging and social cohesion of residents and were subsequently widely employed as the local planning unit in post-war first and third generation western New Towns and later new town planning throughout the urbanising world. The importance of neighbourhood as the fundamental spatial unit for studying the contextual effects on health have since been subsequently recognized by epidemiologists and public health practitioners, especially the health promoting/inhibiting attributes of neighbourhood socioeconomic status, built environment configuration as well as quality of contained and surrounding natural environment.

In this increasingly automobile-dominated period, many notable architects and planners, including Clarence Stein in New York, Barry Parker in England and Le Corbusier in France worked on the idea of segregation of local residential areas and pedestrian routes from mass transit routes employed by car owners with a view to minimize pollution and congestion. In England, the assistant commissioner of police (traffic) at London's Scotland Yard, H. Alker Tripp proposed a distinct street typology for post-war Britain. He introduced the idea of British cities reconstructed on the basis of precincts and comprising a hierarchy of roads. He proposed that the high volume arterial and sub-arterial roads should be void of any direct frontage development and encompass larger block sizes, and would remain sharply isolated from local streets, which would cater to their own shops and service needs (Tripp, 1942). The idea stemmed from potential health benefits of enabling effective segregation of residential areas from street networks associated with high density traffic. Public health concerns have subsequently extended to issues related to minimization of traffic-related pollution and the risks of road traffic accidents, particularly those involving injuries and fatalities from vehicular-pedestrian collisions.

In the 1890s the German planner Rudolf Eberstadt argued that high building density in urban centres effectively raised land and property costs making them unaffordable to the average family. He proposed the creation of zoning laws as an economic solution catering to low density affordable housing at the fringes of the cities (Logan, 1972). This was the start of modern planned land-use zoning, which had both economic and health and wellbeing objectives. According to Logan (1972), the idea was first tested by Franz Adickes, Mayor of Frankfurt-onthe-Main in 1891 wherein the city was divided in to six zones; single family residences, factory, banned industrial uses, old inner city and two others for mixed uses (comprising residential, commercial and light industrial uses). In 1892 suburban Berlin established two-zones. Other German cities followed, formulated their own zoning Ordnances that had elements of the Frankfurt and Berlin regulations including Hamburg in 1896, Stuttgart in 1897, Mannheim in 1901, Hanover in 1902, Nuremberg in 1903, and Munich in 1903 (Logan, 1972). At almost the same time the concept of zoning originated as a land use planning tool in the US, primarily as a borrowed tool from Germany. However, its objectives varied ranging from overcoming the environmental burdens associated with the industrial land uses and minimizing detrimental health impacts to a discriminatory tool aimed at restricting Chinese laundries from certain neighbourhoods. Over the period between 1909 and 1915, Los Angeles segregated residential and industrial land uses by creating 27 industrial districts and almost 100 residence exception districts solely for heavy and objectionable industries (Pollard, 1931). New York City became the first municipality to pass a comprehensive zoning resolution in 1916 putting constraints on land use, building height, bulk as well as lot coverage. It effectively divided the city into three districts or zones: commercial-excluding listed noxious trades and industries, residential and unrestricted zones (New York City Board of Estimate and Apportionment, 1916, McGoldrick et al., 1944). This was a start of a zoning

movement that had strong roots in public health, especially in effecting segregation between non compatible land uses such as polluting industries and residential areas. However, it became somewhat detached from that primary concern over the century; becoming a multi-purpose land-planning tool that was often, to a degree, self-serving.

On another front, community health, with its core principles based on social hygiene and social medicine re-emerged adding a new dimension to the discipline of public health. Charles Booth, a social reformer conducted a detailed survey (1886-1891) to measure and map the incidence and causes of poverty in the working class districts of inner London (the area bounded by Hammersmith in west and Greenwich in east, and between Highgate in the north and Clapham in the south) which formed the basis of the contemporary Registrar General's social class scheme (Booth, 1889, Orford et al., 2002). Rowntree in 1899 conducted a similar study for York. Both the studies concluded that although the general standard of living had improved, a substantial portion of the labouring population had to subsist at extremely low wages well below a level consistent with basic health standards. Unsatisfactory health and social conditions were starkly manifested in the poorer strata of society (Rosen, 1958). Urban poverty resulted in new challenges in the form of high maternal mortality, child mortality, malnutrition and poor health of preschool and school children. Malnutrition, parental ignorance, contaminated food and indirectly, poverty, were identified as the preventable causes of child mortality. On the public health front, this period saw the emergence of the child and maternity welfare movement in Great Britain. United States and Western Europe, primarily focusing on preventive approaches, especially improving hygiene, eradication of nutritional deficiency and antepartum care. Pre-maternity services for expectant mothers in hospitals and health services for school children were prioritised. At the same time, proofs of non-

microbiological causes of disease began to emerge thereby somewhat reinforcing the belief in these more holistic preventive practices.

Another important dimension emerged as nutrition science, which had primarily concerned itself with the calorific value of the food intake but re-oriented itself to provide rational explanations of the biochemical and metabolic processes. The term vitamin was first coined in 1911 by the Polish chemist Casimir Funk and the subsequent years witnessed the emergence of the concept of *deficiency disease*. A series of accessory dietary factors and vitamins were isolated and subsequently associated with specific diseases (Rosen, 1958). Between 1918 and 1922, vitamin A and E were independently isolated by E. Mellanby in England and E. V. McCollum in the United States. Deficiency of vitamin D provided a logical explanation to the patterns of rickets and cod liver oil was employed as an effective treatment. In the United States, Joseph Goldberger conducted an extensive study on the role of socio-economic factors in the observed population patterns of deficiency diseases. He identified nutritional deficiency owing to inadequate diet as the primary cause of infection in pellagra (Terris, 1964). Subsequently along with Edgar Sydenstricker, he conducted one of classic studies in the social epidemiology of pellagra in the cotton mill villages and tenant farmers of rural South Carolina. In addition to dietary deficiency, they observed that enforced poverty arising from crop failures was associated with increased incidences of pellagra (Goldberger et al., 1920, Rosen, 1973). Major Greenwood (1935) introduced the term *crowd diseases* to highlight the role of social environments in disease causation. He used metaphoric terms such as seed, soil and animal husbandry which were subsequently formalized as agent, host susceptibility and environment by Hampton Frost (1941) within a holistic causal model of disease that is now de riqueur.

# 2.3 Post-war aftermath: Planning and emergent epidemiological paradigms

Post-war Britain witnessed unparalleled socio-demographic transformations. Immediately after the war, Britain underwent several phases of a waxing and waning of population (see Figure 2.1). The initial baby boom of 1945-47 was followed by an eventual phase of population decline almost to the level of 1930s. However, this was followed by another unprecedented rise in the national birth rates over the period 1955-1964 and a subsequent slight decline. By the late 1960s, the average natural population increase per annum was considerable at approximately 300,000. Social changes such as post war marriages and economic prosperity in the form of avenues for jobs and education meant that the average household size fell significantly from 3.7 members in 1931 to 2.9 members/home in 1971.



**Figure 2.1.** Births and deaths in the UK. Source: *Based on projections of 1996 from the Office of National Statistics and derived from Hicks and Allen (1999).* 

There was strong and continued inter-regional migration especially from Scotland, Wales and Northern England towards the Midlands and South in search of employment. These demographic changes created increasing demands for new housing and urban development especially around the urban cores of the Midlands and the South.

To deal with the increasing demands of such a rising population, immediately after the Second World War, the concept of New Towns was conceived and transformed into legislation in the form of the New Town Act of 1946. In the period between 1946 and 1950, 15 first generation New Towns were designated, eight of them established in a ring around London with an objective of meeting the increasing housing demands. These were conceptualized as satellite towns maintaining the equilibrium between the size and structure of populations and demands for jobs. Each of the towns was designated to cater for a population of around 50,000 people and built on the concept of a neighbourhood that provided easy access to health and welfare-promoting services. This started a heyday for government-organized city building in pursuit of public goals, including environmental quality and public health. There were separate zones in these settlements for residential and industrial activities surrounding the geographically centred town centre (Self, 1972). The first generation new towns laid special emphasis on neighbourhoods with low density housing with gardens, balanced mix of employment types, pleasant rural style landscaping, and statutory green belts. However, these were based on the 1947 planning system which had misestimated the rate of population and economic growth as well as the capacity of the government to cope with the rate and direction of change. As the population trends continued to be revised upwards, there was far greater demand for housing and public services than had been foreseen. The Town Development Act was passed in 1952 to allow developments in the county districts, thereby

relieving the stress on the urban centres. The New Towns of Cumbernauld and Hook were designated as a result of this Act, (Hook never being built). These were early examples of the evolving regional cities characterized by compact, high density, multi-level town centre, connected to the suburban villages by a system of footpaths. A well defined hierarchy of roads enabled segregation of walkable roads from mass transit routes. Although the creation of New Towns resulted in a decentralization from urban cores to beyond the suburban fringes, nonetheless, employment and services could not keep pace with the economy's natural urban dynamics. Furthermore, the continuous increase in population, rising affluence and the growth of private enterprise in the late 1950s saw a multifold increase in car ownership and the mass motorization of Britain. This brought to a close the idea that planned satellite towns are a kind of quality-of-life intervention substantially different from more general suburban development. The census of 1961 indicated that the population of major conurbations was spilling over beyond the green belts so that rural districts were experiencing a much faster growth than the urban areas. The carefully designed social, economic and public-health conscious environments of the new towns became just another expression of suburban sprawl.

With the aim of overcoming the economic problems associated with such rapid sprawl as well as satisfying the ever increasing demand for housing and services, planning underwent a paradigm shift with special emphasis on comprehensive regional level planning and economic renewal. Several third generation New Towns were designated over the period 1961-66 as multi-growth zones, primarily to act as counter magnets to the existing urban conurbations, thereby reducing the social and economic burdens of environmental spill-overs, congestion and long distance commuting. The strategy had shifted from the growth of completely new areas (as in the first and second generation New Towns) to designation for

expansion of a pre-existing large town into a regional city giving due consideration to regional economic and social dynamics and environments. This meant that the third generation planned towns were much larger in size than their predecessors, with planning targets typically ranging from 100,000-250,000 people. Furthermore, a considerable portion of these were constituted by older towns in need of retrofitting and regeneration. These included Milton Keynes, Northern Buckinghamshire, Northampton, Peterborough and Southampton with London as their focal point; Redditch and Dawley - Wellington - Telford in the West Midlands to accommodate Birmingham overspill; Skelmersdale and Runcorn, designated to receive Merseyside overspill; Warrington and Central Lancashire for Manchester spill-over; and Washington, south of Newcastle to receive the spill-over from Tyneside and Wearside. House building had risen from a meagre 8100 units in 1944 to 413,700 new dwellings in 1968 (Hicks and Allen, 1999). The trends in urbanization and housing construction are indicated in Figure 2.2a and b respectively.



**Figure 2.2a.** Trends of urbanization in England and Wales from 1851-1981; plotted on data derived from the UK Census Summary Tables and General Tables.



Figure 2.2b. Trends of house construction in Great Britain. *Source: Derived from Hicks and Allen (1999)*.

The negative impacts of urbanization were more pronounced in the most inner city areas, often characterized by reduced employment, residential deterioration, overcrowding and socio-economic deprivation. This has been variously and collectively attributed to the policies of dispersal, slum rehabilitation, road building and re-development, removal of backstreet factories, zoning constraints as well as the decline in birth rates. Fundamentally, the deterioration of inner city neighbourhoods is a problem of inadequate re-investment, associated with the pattern of land ownership in the UK and the spatial pattern of jobs, housing submarkets, local taxation revenues and social problems with considerable adverse impacts upon public health. Over the period between 1969 and 1975, the inner areas of Manchester witnessed 20 percent decline in its population, Liverpool 40 percent, while Glasgow lost an astounding 60 percent of its population (Department of Environment, 1977b, 1977a, 1977c). In some ways, planning to address the public welfare challenges in such areas was a more intractable problem than planning for healthy and viable environments in the suburbs and exurbs.

In the US, the impact of post-war urbanization upon social life and health were more detrimental than in the European experience. Immediately after the war, two simultaneous processes of human migration occurred. While the White families migrated outwards from the metropolitan areas to the peripheral suburban rings, Black labourers moved from the rural South towards the Northern cities. In order to cater for the increasing demand for housing and services, urban sprawl became more pronounced. Low density leap-frogging suburbanization meant development dotted with areas of intervening underdeveloped land resulting in wasteful use of natural resources, pollution, consumerism as well as reduced accessibility and increased dependence on motorways and private cars. By the early 1960s most major US cities were undergoing a phase of deindustrialization as industries relocated away from the urban cores (Lee, Seo and Webster, 2006). This resulted in significant economic and physical decline in inner neighbourhoods manifested in the form of remnant land degraded by noxious waste and pollution in formerly local industrial areas as well as in loss of jobs, income reduction and the social, health, educational and crime issues attendant to clusters of low income and 'left-behind' households. In response to such transformations in the labour and real estate markets, pre-existing zoning Ordnances were further revamped. Unlike the conventional practice of land use control in Britain, policies in the US relied exclusively upon the strategy of zoning which per se had never been the offshoot of a well conceived comprehensive plan. Although such a policy proved effective in segregating disparate land uses, notably residential and noxious industries, nonetheless, they proved to be only semi-effective in controlling the spread of private development into the open countryside. Another drawback of zoning Ordnances was their use in pursuit of racial and economic residential segregation. Restrictions on minimum lot size, multi-family dwellings as well as the presence of detailed specifications for

allowable housing size and housing materials proved to be exclusionary for low income and minority families (Branfman et al., 1974, Maantay, 2001).

In the name of general public welfare and environmental (and ultimately individual) health, land-use zoning laws became widely experimented with in many if not most sprawling cities of developing countries. In these cases,, the joint pressures of an accelerated pace of urbanization, undeveloped or ineffective governance have meant that zoning has largely remained ineffective, often violating the essence of *comprehensive planning* and being associated with externalities that *aggravate population health* rather than improve.

The end of the Second World War was also accompanied by a marked transition in the health profile of the developed countries. This was manifested in a significant decline in the rates of infectious diseases and epidemics attributed primarily to better hygiene, nutrition and living conditions accompanying the economic and social developments as well as innovations in drug delivery and scientific applications of vaccines, chemotherapy and antibiotic (Rosen, 1958, McKeown, 1979). Two points deserve special mention. Firstly, the economic and social developments as well as achievements in the field of epidemiology and public health caused demographic changes. The increments in life expectancy (which ranged from 70-80 years in most developed countries) and the decline in infant and child mortality caused the population distribution to shift towards the middle and older ages. The demographic changes in the UK are shown in Figure 2.3.



Figure 2.3. Trends of life expectancy and infant mortality in the UK; *Source: Derived from Hicks and Allen (1999)*.

Secondly, the increasing socio-demographic pressures of urban life manifested themselves in the form of newer and increasingly difficult health issues and challenges such as stress, mental illness and complex environmental health risks of non-infectious etiology such as those resulting in a rise in incidences of obesity, respiratory and cardiac diseases. The severity and fatality of *'urban'* diseases have reduced over the years through innovative medical interventions.

Nonetheless, their *chronic* nature introduced new challenges to epidemiology and public health in terms of their eradication on account of their long insidious latency and multiple-causality. In particular, there was an alarming rise in the prevalence of chronic diseases related to exposure to toxic pollutants, sedentary lifestyle, social, occupational and age related factors, especially rheumatic heart disease, peptic ulcer, cardiovascular disease and lung cancer (Morris, 1955, 1957). Similarly, higher population density, as well as increased competition for resources and social opportunities contributed to higher incidences of psychological stress and mental disorders. Currently in Britain (89.9% of which is urbanized), almost 16% of adults population suffer from one or more of mental disorders at any given time (Jenkins et al., 2008), while up to 10% of children are prone to learning difficulties such as dyslexia, considerably reducing their ability to achieve good grades at school (Challen et al., 2008).

#### 2.3.1 Chronic disease epidemiology

In the United Kingdom, the studies conducted by Richard Doll, Bradford Hill, Jeremy Morris, Donald Reid and Thomas McKeown established chronic disease epidemiology as the new paradigm. The focus was broadened beyond infection to study the role of unknown multiple causes or risk factors. The consideration of multiple risk factors was able to provide logical explanations as to why certain individuals exposed to the disease don't get it while, some of the unexposed get the disease. The objective was to identify single risk factors among the multiple risk factors with the help of the standard 2-by-2 table which compared the counts of diseased versus the non-diseased classified by exposure to a specific risk factor. This was made possible through significant advances in epidemiologic survey design and data analysis that occurred almost simultaneously during this period. Cross sectional surveys, population study of incidence, and repeated cross sectional surveys paved the way for cohort design and case control

studies. On the statistical front, odds ratios and relative risk began to be better understood and appreciated, while path analytic models began to be employed for causal inferences. Following the contributions of Mantel & Haenszel in 1959, multivariate relationships began to be extensively employed. Long before, Ryle had observed, in a spirit that anticipated multivariate analysis, that people with specific lifestyles were more vulnerable to stress which makes them predisposed to peptic ulcer (Ryle, 1948). However, the real fruits of this period were in the form of the classic case controlled and cohort studies, wherein, for example, Doll & Hill meticulously tested their hypothesis of the association between smoking and lung cancer, thereby espousing the case for an environmental causal model (Doll and Hill, 1950, 1956). In the United States, one of the earliest prototypes of cohort studies was initiated in 1947 to identify the factors influencing the occurrence of heart disease in adults (aged 30-59 years) in the town of Framingham at the outskirts of Boston. The Framingham Study started with a representative sample of 6000 respondents and had the ambitious protocol of biennial examination over the subsequent 20 years (Gordon and Kannel, 1970, Dawber, 1980). The term risk factor originated from this study wherein the Framingham study group concluded that cardiovascular disease was a result of a number of contributing causal factors as opposed to a single one. At a later stage, the project was devoted specifically to the study of stroke, cardiovascular diseases and other morbidities associated with ageing as well as the follow-up of the off-spring of the original respondents. Morris (1957) conducted another series of classic cohort studies that identified serum cholesterol and smoking as risk factors in coronary heart disease onset. In another ground breaking review of the causes of cancer Doll and Peto (1981) concluded that up to 80% of variation in the incidence of malignancies was attributed to differences in environments. These studies provided credibility to risk-factor epidemiology establishing it as the successor to the then fading specific-cause germ theory. The principle of multiple proximate risks for a single disease was more holistic and endeavoured to combine the multiple disciplines of social, biological and statistical sciences. The population-based inferences of risk-factor epidemiology had striking similarities with maisma theory espoused by the hygienist and social reformers of the 19<sup>th</sup> century.

Proponents of risk-factor epidemiology popularized it initially as a method of disease prevention through the identification and isolation of risks (Savitz, 1994). Nonetheless it encountered the major criticism of being void of a distinctive theory of disease occurrence at the population level resulting in the alienation of epidemiology from public health practice (Krieger, 1994, Pearce, 1996, Susser and Susser, 1996a). Consequently, it effectively became a largely observational science focusing on the identification of risks rather than explanation of causal factors (Schwartz et al., 1999) A classic example is that despite the identification of smoking as a risk factor for lung cancer, intervention strategies have largely remained ineffective primarily on account of overlooking the mediating role of social, behavioural and genetic aspects that may predispose a person to smoking. Risk factor epidemiology had become something of a black box paradigm. The black box was a self contained unit with an opaque interior, a metaphor for an *individual* whose underlying inner biological processes remain hidden and unexplored (Lakoff and Johnson, 1980). There was a predominant emphasis on the associations between exposure to a maze of proximate environmental risks and diseases while grossly overlooking macro-level contextual social factors as well as the underlying micro-level biological mechanisms involved in disease causation. Mckinlay (1994) termed such an increasing focus on generic methods and risk factor identification and a gross neglect of causality as *biophysical reductionism*. Taubes et al. (1995) stated that such a fervent search for links between lifestyle risks leads to the Catch-22 of

modern epidemiology. At a macro-level, Vandenbroucke (1988) pointed out the lack of specificity in the definition of environment and the apparent failure to recognize the levels at which the environmental factors operate. The inherent unidimensionality arose on account of these studies being conducted at the individual level with most of the identified risk factors pertaining to individual lifestyles. Population level inferences were erroneously conceived on the assumption that population risks were simple aggregations of individual level risks as mediated by the individual's lifestyles. Measurements at the individual level when aggregated, were valid at the population level. This overlooked the structural and relational attributes of the organized aggregates at the population level and resulted in a disregard of the social and behavioural models of disease causation (Loomis and Wing, 1990, Pearce, 1996, McMichael, 1999). Furthermore, the biases of the study designs (for example the case control studies) and the existence of multiple confounding factors made it almost impossible to detect weak associations as well as mediating and linking effects in the causal chain (Taubes, 1995, Schwartz et al., 1999).

#### 2.3.2 Molecular epidemiology

By the third quarter of the 20<sup>th</sup> century there was a general consensus that individuals manifest varying degrees of vulnerability to exposures from specific environmental agents. The significant technological advances in molecular biology led to studies of the potential role of gene-environment interaction in the disease etiology (NIEHS., 1993, NIEHS., 1994). Motulsky (1962) was one of the earliest to articulate the idea that genetic mutations affected the nature and rate of drug metabolism and could provide a causal explanation of differential disease susceptibilities. Genetic epidemiology emerged as the study of the reciprocal interactions between the internal genetic characteristics of the body (genetic susceptibilities/predispositions) and the external environmental agents

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(pollutants, ionizing radiations etc) at an individual level (Khoury et al., 1993). Subsequently, in the early 1980s, the term molecular epidemiology was first coined by Perera & Weinstein and popularized as a framework for the study and understanding of the molecular basis of carcinogenesis (Perera and Weinstein, 1982, Perera and Weinstein, 2000). Molecular biological techniques and biomarkers have now been extensively employed for the measurement of internal exposures, detection of biological responses and identification of effect-modifying host characteristics (Hulka et al., 1990). The objective has been to explain between-individual variations in cancer risk through the understanding of the genetic basis of complex interactions between environmental agent and individual susceptibility factors (both inherited and acquired).

However, molecular epidemiology has been viewed by some as the contemporary equivalent of the germ theory of the late nineteenth century on account of its mechanistic view of disease causation at the molecular level. The primary objective has been to conduct randomized clinical trials for the screening of susceptible individuals in the population and thereby performing personalized risk assessments through measuring phenotype, adduct load and acquired mutations (Shields and Harris, 1991, McMichael, 1994). Such a bottom-up reductionist approach overlooks critical factors of disease causation at the population level, especially with respect to the determinants and spatial distribution of disease in populations. Nonetheless, given that chronic disease is multi-factorial in nature and characterized by multiple exposures and variable susceptibilities, it is reasonable to suppose that molecular epidemiology and risk factor epidemiology can act as a powerful tools when integrated together, rather than antagonizing or replacing one other. Such an approach essentially overcomes the weaknesses associated with the 'black box' in risk factor epidemiology by providing deeper insights in to the underlying biological

mechanisms involved in disease causation by identifying the physiologic responses to internal biochemical exposures to risks (Vandenbroucke, 1988, McMichael, 1994).

This leads to a more powerful paradigm for studying the health performance of cities: individual health is explained by gene-behaviour-environment (natural and built) interactions.

#### 2.3.3 Social epidemiology

The role of environmental socio-contextual factors in disease causation was deflected in the eras of Germ theory and risk factor epidemiology. The shift in emphasis over the course of the century from the environment per se to a set of specific pathogenic, behavioural and lifestyle level factors within the environment resulted in uni-dimensional individualism in epidemiologic research. The predominant focus on individual-centred approaches resulted in relative dissociation with the social factors, which although operating at population levels, often configure the individual-level determinants of health. The importance of the social determinants of health was reinvigorated following the contributions of Joseph Goldberger, Edgar Sydenstricker, Major Greenwood and Wade Hampton Frost in early part of the nineteenth century. Increasing consensus towards the restoration of the overlooked social factors responsible for population patterns of health and disease causation led to the evolution of modern social epidemiology (Rosen, 1947, Galdston, 1949). In an investigation of the role of social disparities upon fetal and infant mortality Alfred Yankauer introduced the term social epidemiology in all probability for the first time in 1950 (Yankauer, 1950). Reeder (1972) defined social epidemiology as the study of the role of social factors in the aetiology of disease while, Berkman and Kawachi (2000) defined it as the study of the social distribution and social determinants of the states of health. The social factors/determinants in the definitions tend to pertain to three cardinal strands of stratification: race, gender, and class, each of which are thought to play a mediatory role in influencing degree of exposures to risk factors, behaviour, physical constitution and other causes of disease (Rothman, 1992, Krieger et al., 1993). They have been termed as the "fundamental social causes" of disease as they strongly influence an individual's ability to avoid risks or minimize the consequences of disease once it sets in (Link and Phelan, 1995)

The general approach has been to study the pathways by which socio-economic stratifications at the population level contribute to differentials in the health and burden of disease. To elucidate the impact of population level social transitions upon physiological and psychological health, Casel et al. compared two contrasting studies. In the first study they compared the health of two population groups of contrasting social class - first generation industrial workers versus second-third generation workers. The second study, on the other hand, assessed the health of stable rural residents of North Carolina counties, experiencing varying degrees of urban growth. Both studies concluded that incongruity in demands of the emerging and existing social systems resulted in poorer health outcomes (Cassel et al., 1960, Tyroler and Cassel, 1964). In another of his seminal works, Cassel highlighted the role of psychosocial factors of the social environment including dominance hierarchies, social disorganization, rapid social change, social isolation, bereavement and social support in altering host susceptibilities to risk factors by affecting neuro-endocrine function. According to Cassel, the psychosocial factors in conjunction with the risk factors provided a logical explanation of observed social disease gradients (Cassel, 1976). Subsequently, many studies have found a detrimental association between psychosocial stressors and prevalence of disease (James and Kleinbaum, 1976, Thoerell, 1981).

Several studies have highlighted the role of social status in the etiology of a variety of somatic diseases, especially coronary heart disease (CHD). The general trend has indicated higher levels of incidences of CHD among blue collar or lower educational groups after controlling for other risk factors (McQueen and Siegrist, 1982, Siegrist et al., 1986). Marmot and Syme (1976) investigated the incidence of CHD amongst Japanese Americans and established that population-level health differentials are not genetic and hence can't be explained in terms of the individual in isolation. Rather, the cumulative socio-economic profile of the individual contributes to such population level differentials. In a 40 years study of the trends of mortality from heart disease in England and Wales Marmot et al. (1978) noted a shift in mortality patterns; the risks from heart disease increased progressively in social classes IV and V over 1951-71 in contrast to the higher mortality observed in social classes I and II over the earlier period 1931-51. Marmot and his co-workers conducted two classic cohort studies (popularly called the Whitehall Study of British civil servants) separated by a timegap of 20 years to assess the potential relationship between social class and mortality in a wide range of diseases. A significant inverse association between morality and grade of employment was observed in both studies, and this relationship persisted over the time period (Marmot et al., 1984, Marmot et al., 1991). The Whitehall study II reported a three-fold difference in the prevalence of ischemic heart disease between the lowest and highest grades of employment. The difference was two-fold in the cases of self-reported ill health, cough and sputum. Similar trends in CHD mortality in unskilled workers have been independently documented by Koskenvuo et al. (1980). In another study, Weinblatt et al. (1978) had reported that the risks from sudden cardiac death was more than three times higher in low-education group compared to the better educated category. Several other studies have highlighted the racial gradient in health indicating higher mean blood pressure levels and corresponding mortality

and hypertension related disorders among Black Americans in reference to their White compatriots (Scotch and Gierger, 1963, Stamler, 1967).

Subsequently, Rose (1985, 1992) provided a stronger conceptual basis for the importance of cumulative population-level socio-economic factors in disease causation. He proposed that practically none of the risk-disease relations are exactly binary with a logistic form; the risks are not discrete, but rather are distributed along a continuum. Minor shifts in the risk band of a population can thus result in marked differences in the health of the population. Based on his investigation of the rates of cardiac heart disease, he identified that the different sets of factors act to produce between-population variability and between-individual variability. He strongly espoused a distinct differentiation between the *causes of cases* that focuses on high risk individual through an assessment of individual level susceptibilities and *causes of incidence* which studies the disease distribution in the population corresponding to the associated risk continuum to which it is exposed.

#### 2.3.4 Contemporary epidemiologic paradigms

There is a general consensus that each of the epidemiological paradigms - risk factor, molecular and social, when employed simultaneously but independently cannot on their own explain disease causation. Appreciating the necessity of an integrated approach, Nancy Krieger introduced so-called *eco-social epidemiologic theory*. She defines this as:

"a paradigm that embraces population level thinking and rejects the underlying assumptions of biomedical individualism without discarding biology".

In her effort to integrate the biologic and social factors of disease causation, she visualized the existing metaphor of the web of causation, but this time with two 'spiders', a social and a biologic. The metaphor of eco-social epidemiology was

further refined as a self-replicating fractal object to reflect the interlinked and diverse patterns of susceptibility from the sub-cellular to the societal levels of organization (Krieger, 1994, Krieger, 2001). Such a conceptualization is a manifestation of the fact that health and disease self-evolve in space and time as a result of complex interactions between interlinked multiple and multi-level factors.

Along similar lines, Susser and Susser (1996b, 1998) advocated the necessity of an integrated approach wherein the *universalism of physical sciences* are complimented by the *ecologism of biological sciences*. They proposed a so-called *eco-epidemiologic paradigm* encompassing the macro-, meso- and micro-levels of causal analysis. This has been employed as a comprehensive theory for both the infectious disease of human immunodeficiency virus (HIV) and the chronic disease of peptic ulcer. The *black box* metaphor was replaced by that of *Chinese boxes* (a sequence of interconnected boxes, each box enveloping a succession of smaller ones), thereby manifesting multiple-level causality. *This implied that the causes of disease should be studied with respect to factors identified at multiple levels of organization from the molecular/ cellular level to individual level and then the population, ecological and societal levels. Each level is thus construed as a distinct system that inter-relates and interacts with the others, the relations within and between the systems being conditioned socially, spatially and biologically.* 

McMichael (1999) provides a cognitively powerful visual model of modern epidemiology being constrained (imprisoned) by the cube with axes indicating our over-emphasis on proximate risk factors, individual level of analysis, the static/ modular view of temporal (life-course level as opposed to more static cross sectional studies) variations in risks and with limited forecasting ability. He argued that modern epidemiology should follow an integrated approach wherein its range

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is broadened from proximate to distal factors, individual to population level of analysis, modular to life course as well as being fully accustomed to forecasting future health risks from global environmental change. Such multi-level and allembracing eco-epidemiological frameworks are pedagogically and philosophically compelling. Nonetheless, their practicality in terms of application via the identification of multi-causal pathway theories, models and studies is still underresearched.

This is the scholarly context in which this thesis is placed: both the conceptual contribution of the 'urban health niche' (introduced in the subsequent Chapter) and the empirical studies of multiple and multi-scale social-spatial-biological risks of specific morbidities are attempts to explicate, both conceptually and empirically, the multiple causality measureable at different organizational units and spatial scales.

The successes of such integrated models depends upon robust statistical methods for multilevel analysis, aimed at identifying the nature of correlations, variabilities and error distribution at individual, population and intervening levels (Susser, 1998, Krieger, 2001). This is the spirit in which the studies in Chapters 5-8 have been conducted.

## 2.4 Conclusion - Re-connecting the chord between urban planning and public health

It is the advent of advanced statistical methods for multi-level modeling, together with advances in spatial data manipulation technology and statistics that permit a re-unification of urban planning and public health analysis. It may be supposed that this will make possible and encourage a reunification of applied analysis and interventions by the respective professions.

The predominant focus on individual level risk factors and molecular mechanisms involved in disease causation had resulted in an epidemiological oversight of the effects of the attributes of place upon well being, health and disease. In the UK a distinct chasm had appeared between the disciplines of town planning and public health, with town planning focusing lesser on issues related to public health, considered a niche of the therapeutic health services. At the policy level, such a weak structural integration between the disciplines was in fact manifested by the organizational re-structuring in 1943, wherein the then new Ministry of Town and Country Planning was created, effectively divesting planning from the Department of Health (Talbot, 1998). Nonetheless, since the late 1980s, there has been a resurgence of interest in this historic link, driven by the greater emphasis among public health scholars and practitioners on the role played by contextual factors; also termed place effects or neighbourhood effects (Blaxter, 1990, Humphreys and Carr-Hill, 1991, Krieger, 1992, Diez Roux, 2001). Place effects include neighbourhood-level socio-economic conditions as well as the attributes of the built and physical environments.

Since the early 2000s, epidemiology, public health and urban planning disciplines have begun to grapple with a revised version of the 19<sup>th</sup> century idea of *miasma of the built environment*. Three emerging health and demographic patterns consolidate such an argument, namely:

 The increasing number of epidemiological studies highlighting the impending worldwide obesity epidemic (Wang et al., 2011), including the significant increments in the prevalence rates of childhood obesity (Ebbeling et al., 2002, Lobstein et al., 2004) and the associated direct and indirect health costs (Allender and Rayner, 2007)

- The significant increases in psychological disorders accounting for 14% of the global disease burden and 28% of all disability-adjusted life-years (Prince et al., 2007)
- 3) Significant demographic shifts with almost 3.4 billion people now living in urban areas, a figure that is estimated to rise to 6.3 billion by 2050 (United Nations., 2010); and a projected doubling of the population of those aged 60 years and above from 11% in 2006 to 22% of the global population by 2050 (WHO., 2007).

There has been a growing consensus amongst epidemiologists that built environmental factors, especially those influencing the health of eating behaviour and physical activity are driving the obesity epidemic. Similarly, the health promoting/inhibiting influences of built and physical environment upon mental health outcomes are becoming better understood as are the detrimental effects of declining physical built environment upon geriatric health. Recently, there has been a trend in urban planning research that focused on ways to plan a city that is activity friendly and aesthetically pleasing and accessible. This resurgence of a public health agenda in urban planning, where health and well-being sit alongside economic and environmental objectives to be optimized in planning, has focused on questions such as: How do we design an activity friendly city that promotes walking and cycling? How can urban design optimize the accessibility to service destinations (health promoting capital) in a way that contributes to active living? How can an aesthetically pleasing physical environment contribute to improved mental health outcomes? These and other such questions are discussed in more detail in Chapter 4.

A series of high level policy reports have highlighted the necessity to incorporate health considerations in urban planning and policy. In 1987, the World Health

Organization Regional Office for Europe initiated the WHO European Healthy Cities Network (WHO-EHCN) with a strong commitment to implement and consolidate the principles of Health 21 and Agenda 21, and thereby attempting to operationalize principles of health equity. The initiative was grounded upon the five basic tenets of equity, participation and empowerment, working in partnership, solidarity and friendship and sustainable development, requiring a close collaboration between local governments and community organizations (Webster and Lipp, 2009, Barton et al., 2009). The project followed a holistic view, defining a healthy city as "one that is continually creating and improving those physical and social environments and strengthening those community resources that enable people to support each other in performing all the functions of life and achieving their maximum potential" (Hancock and Duhl, 1988). The Zagreb Declaration for Healthy Cities was launched during the fifth phase (2009-2013) of the WHO European Healthy Cities Project (WHO-Europe., 2009). One of the new concerns and challenges identified related to how the built environment and new technologies affect the health of citizens; and the report emphasized the importance of integrating health and sustainable development considerations in questions of how we plan, design, maintain, improve and manage cities and neighbourhoods and how we use new technologies. Reinforcing the concept of urban health, the core theme of phase V of the WHO European Healthy Cities project revolved around:

- Creating caring and supportive environments: A healthy city is a city for all its citizens, being inclusive, supportive, sensitive and responsive to their diverse needs and expectations.
- Healthy living: A healthy city provides conditions and opportunities that encourage, enable and support healthy lifestyles for people of all social groups and ages.

3) Healthy urban environment and design: A healthy city offers a physical and built environment that encourages, enables and supports health, recreation and well-being, safety, social interaction, accessibility and mobility, a sense of pride and cultural identity and is responsive to the needs of all its citizens.

A parallel urban health initiative in the US was spearheaded by the Department of Health and Human Services when it launched the Healthy Community concept in 1989. The National Civic League, with federal support, formally launched the Healthy Communities Initiative. State-wide initiatives, especially, Healthy Boston, California Healthy Cities Project and Healthy Cities Indiana were the pioneers of the US Healthy Community Movement (Norris and Pittman, 2000). A workshop report of the Institute of Medicine (2001) had identified the built environment as that part of the environment designed and constructed by humans, and which presents as many opportunities as challenges to environmental health (pg. 18-27). It highlighted the importance of innovative design in smart growth of urban areas; stressing that smart growth has many positive effects on the economy, attracting new businesses, encouraging development, and making health problems easier to address in the local community. Underscoring the increasingly important influence of design and configuration at the community level on individual activity behaviours, the Centres for Disease Control and Prevention (CDC) introduced the term Active Community Environments (ACES) as places where people of all ages can easily participate in physical activity. Several studies have gathered evidence of associations between ACES and physical health (Doyle et al., 2006, Frank et al., 2003, Hoehner et al., 2003). In the United Kingdom, the Department of Health, 2005, highlighted two sets of design guidelines aimed at achieving physically active lifestyles. The NICE Guidance (2008) stresses the role of environmental factors above and beyond individual level interventions in influencing physical activity behaviour. The environment is

defined as: 'any aspect of the physical (natural) environment or the urban or constructed (built) environment that subconsciously or consciously relates to an individual and their physical activity behaviour' (Foster and Hillsdon, 2004). The Active Design Report published by Sports England lays out recommendations from the chief medical officer for active living wherein the activity can either be physical activity (structured exercise, sports), lifestyle activity (climbing stairs, cycling, brisk walking etc) or a combination of both. Highlighting the importance of neighbourhood activity space in configuring individual activity behaviour, Active Design provides a series of innovative design guidelines for master planning of major housing and mixed use development schemes with an aim to promote easy access to a choice of opportunities for sport and physical activity; thereby making new communities more active and healthy. The Active design checklist lays out the three active design objectives of improving accessibility, enhancing amenities, and increasing awareness to promote the recommended levels of physical activity (Sports England., 2007). Very recently, The Lancet Commission conducted an in-depth study into the potential associations between the physical fabric of towns and cities upon health and the role of urban planning in improving health (Rydin et al., 2012). The Commission recommended that:

"improved urban health outcomes will need a concerted effort to create and maintain the so-called urban advantage through reshaping city environments. Furthermore, such urban planning needs to take account of the inequalities between cities across the world and within individual cities when devising policy. Urban planning efforts should be based on a complexity approach that recognises multidirectional causality, feedback loops, and unintended consequences. Such an approach is more capable of producing effective action than are more conventional linear approaches. An integral part of such a complexity approach is an emphasis on project-based experimentation and social learning through discursive and inclusive assessment". (pg. 2012).

The report recognizes that the identification and analysis of the contextual effects on health status and inequalities is complicated and requires a complex system approach to delve deep into urban dynamics and the underlying social and environmental processes that constitute and shape a city and the health of its population.

I conclude by advocating the necessity of a fundamental paradigm which acknowledges the evolving holistic epidemiological paradigms and aims at a stronger collaboration and integration between the disciplines of city planning and health policy in the present urbanized world order. Such an integrated public health paradigm should essentially be multi- and interdisciplinary with an objective to not only enable effective organization of data for empirical research but also multisectoral policy interventions. This has been eloquently highlighted by Materia and Baglio (2005):

""Multidisciplinarity". "Integration". "Context". That these have become key terms in public health vocabulary and core features of the health systems can be seen in the multidisciplinary approach to biomedical research and clinical medicine and in the increasing interest in "alternative" medicine." (pg. 534).

Unlike the holism of some branches of alternative medicine, however, the complexity of causes of health disparities in cities can be modelled, since we now have the technology to create multi-scale population and environment variables that can be investigated in multi-level models of individual health. The empirical studies in this thesis show just how far we can extend such analysis with current technology. The models employed in those chapters test hypotheses about health–urban configuration associations using systemic measures of accessibility, capturing the influence of an individual's proximity to multiple health-enhancing and detracting environmental and population effects at multiple spatial

scales. As far as the author knows, this has not been done in this level of detail before.

### Chapter 3: The concept of urban health niche as a new paradigm in healthy city planning

### 3.1 Introduction

With increasing urbanization and the resulting spread of sedentary lifestyles, there has, as I noted in Chapter 2, been a marked transformation in the problematisation of health, with a transition from *infectious* to *chronic* disease etiology. The primary focus of contemporary epidemiology has shifted towards conceptualizing *causality* as well as isolating *causes* (Susser, 1991). This has led to the evolution of more sophisticated and holistic paradigms of epidemiology involving a range of complexities of multiple levels, multiple causal pathways, non-linear interactions as well as temporal dynamism. Such paradigms have been based on a bottom-up approach striving to understand and influence disease causation from a molecular level, moving upwards towards the population level as well as the more conventional top-down approach, which starts at the population level and studies disease causation as a result of the processes and mechanisms intrinsic to it. Vandenbroucke (1988) had strongly argued for the former stating that disease (cancer) incidence rates can best be explained by the interplay between genes and environment. Pearce (1996), on the other hand, posited that the bottom-up approach is reductionist and positivistic and the etiologic framework of a disease should be conceptualized at the population level. The need for a more integrated approach encompassing multiple epidemiological branches and taking into consideration proximal as well as the distal influences on health outcomes has been highlighted by several authors in recent years (Krieger, 1994, Susser and Susser, 1996b, McMichael,
1999). In her eco-social epidemiologic model, Krieger (1994) succinctly expressed that a health outcome is quite often a result of complex non-linear interactions between the social and biologic factors so that the *cleavage of the* social from the biologic, and the biologic from the social is not sensible. However, in my view, none of these existing paradigms provide sufficient purchase for simultaneous application in empirical studies as well as being effective in organizing thoughts at the strategic level necessary for healthy city policy and planning debates. This originates primarily because the exacerbating/mitigating role of the characteristics of the city's built environment upon an individual's health is underestimated. Social epidemiologist have tended to place considerable stress solely on social factors as determinants of individual behaviour and lifestyle, often overlooking the triad of contextual built, natural and social environments that configure one another over time to generate corresponding risk factors (dynamically varying with time) and that act in conjunction with the inherent individual level biologic factors to eventually influence health. Secondly, often there exists conceptual disconnect between the different sub-disciplines of epidemiology which act as a bottleneck for effective formulation and implementation of public health intervention strategies. Furthermore, it is often neglected that specific attributes of a place (in essence comprising built, natural and social environment characteristics) and hence the population health, originate as a result of decisions across well defined hierarchies of urban and public health planning systems. This demands an integrated multisectoral intervention strategy built on a multi-scalar and multidimensional analysis. There is thus an urgent need to incorporate contextual environmental considerations more explicitly into existing epidemiological frameworks, given the importance of the built environment in channeling, shaping and moderating the distribution of social and environmental influences on health and health behaviour. Such an all-encompassing approach will essentially enable

urban planners and public health planners to work together using a unified language and model to assimilate the kind of evidence-based epidemiological thought reviewed and developed in this thesis to more scientifically plan for a healthy city.

At the same time, in the domain of urban health planning and promotion there now been a similar consensus about the effectiveness of a more systemic and integrated approach (Diez Roux, 2007, Giles-Corti and King, 2009, ICSU., 2012, Rydin et al., 2012). In recent years numerous socio-ecological models have been developed that endeavour to decipher the relationships between built environment and health promotion in cities (Whitehead and Dahlgren, 1991, Barton and Tsourou, 2000, Northridge et al., 2003, Hoehner et al., 2003, Galea et al., 2005b, ICSU., 2012, de Hollander and Staatsen, 2003). However, it is implausible that the frameworks typically adopted in these studies can act as truly integrative models across the two disciplines since they overlook the existing processes and paradigms of epidemiology as well, in some, as overlooking a an effective dynamic analysis of the functioning of planning systems and their spatial hierarchies. Consequently a biomedical researcher or an urban planner cannot easily relate to such models in terms of practical implementation. Any comprehensive model should in effect help overcome the disconnect which presently exists between evidence based epidemiological research and normative urban health policy and practice, thereby enabling decision making as well as devising effective intervention strategies (Duhl and Sanchez, 1999).

The first section of this chapter conceptualizes the notion of *urban health niche* encompassing the epidemiologic triad of person, place and time, offering a novel paradigm for public health analysis aligned to urban planning. The objective is to effectively integrate the various disciplines of epidemiology within a framework that can guide both public health and urban planning professional interventions.

With the aim of demonstrating the effectiveness of such a unified paradigm, a urban health niche based *healthy city planning model* is proposed in the concluding section of the Chapter. Such a bottom-up planning model has the potential to incorporate and integrate multiple level spatio-temporal health determinants existing at the different level of a city's functional and organizational hierarchies, thereby making it possible to devise intervention strategies at both individual and population levels.

#### 3.2 Conceptualizing 'urban health niches' as the fundamental paradigm in public health-focused urban planning

As epidemiology reorganizes itself using more integrated concepts that encompass *biologic*, *social and built environment factors*, there is a need to identify a fundamental integrated paradigm that is in consonance with preexisting sub-disciplines and that can guide multi-sector interventions. The importance of a powerful model or metaphor cannot be underestimated; especially as an aid to conceptual cognition by the hierarchical visualization of complex webs of connections (Lakoff and Johnson, 1980, MacCormac, 1985). I introduce the concept of the intrinsic *health niche* as the fundamental *paradigm* for conducting urban health research, health-related urban planning and related interventions.

The concept of ecological niche has long been a fundamental organizing concept in modern ecology. It has found widespread application in fields such as community ecology, physiological ecology, population biology and biogeography, and is used to identify a set of environmental conditions that influences the distribution and optimized performance and functioning of a set of one or more organisms. The idea was introduced by Grinnell (1917) to describe the multitude

of environmental requirements of a species, including microhabitat, abiotic factors, resources and predators as well as the physiological and behavioral adaptations that allow the species to respond to such factors. Elton (1927) defined a 'niche' mainly as a functional concept, describing the organism's place in the biotic environment in terms of its relationships to trophic levels and enemies. A more formal definition was given by Hutchinson who defined niche as the total range of environmental variables (physical, chemical and biotic) to which the species must adapt itself and live within if it is to replace itself indefinitely (Hutchinson, 1957).

Assuming that there are *n* environmental variables, then a niche can be described in terms of an *n*-dimensional space or a hypervolume that represent the responses of the species to each of the environmental variables. Huchinson's *niche* provides a means of conceiving of how species relate to the environment and to one another. I extend the idea of ecological niche to introduce the concept of *urban health niche*, as the fundamental ensemble of considerations in urban health planning. The holistic model of health represented graphically in Figure 3.1.

In this framework, each individual is surrounded by a hypothetical hyper volume called the *urban health niche* which encompasses the epidemiologic triad of *person*, *place* and *time*. The urban health niche of an individual in essence is a spatio-temporal manifestation of the causal agents and processes functioning at the micro-, meso- and macro-scales at which the health-defining processes function. As envisaged by McMichael (1999) such a framework is thus able to give due credence to the spatial organization of multiple health defining processes including both proximal as well as distal factors as opposed to an overwhelming preoccupation with proximate risk factors.





The micro-scale encompasses *within-individual*-level processes, especially those involving the immunologic and genetic predispositions to an factors (such as a microbial agent) within the body. This is essentially the domain of physiologic and genetic epidemiology.

At the meso-scale, behavioural and lifestyle level risk factors, especially those associated with nutritional intake, alcohol consumption, smoking status etc. dominate, making it the domain of risk-factor epidemiology.

The macro-scale is the realm of social epidemiology and the epidemiology of built and natural environments wherein neighbourhood-level or city-level processes such as ethnicity, socio-economic status, natural environment (especially air, water, noise pollution, proximity to waste disposal sites, terrain etc), accessibility to services, land use mix, street level design and walkability etc are the principle health defining factors. In essence, the built environment shapes, channels and moderates the distribution of social and natural environmental effects at this level.

If we consider the classic case of coronary heart disease, at a molecular scale, the presence of serum cholesterol may increase the risk ratio. The presence of serum cholesterol in conjunction with high blood pressure may lead to a multi-fold increase in the risks (Wilson et al., 1998). At a lifestyle-scale smoking may aggravate the condition (Morris, 1957, Doyle et al., 1962). Even the presence of a family member in the household who is a smoker may increase the risk ratio on account of passive smoking (He et al., 1999). At a neighbourhood scale, living in areas associated with high deprivation may increase the risks (Sundquist et al., 2004, Diez Roux et al., 2001) while, living in a *good* neighbourhood may be beneficially associated with the prevalence of CHD (Mujahid et al., 2008a).

(Mitchell and Popham, 2008). Each spatial scale by itself may be considered as a sub-system. Furthermore, the impacts of the constituent factors are often synergistic and associated (within and between sub-systems) in non-linear ways, acting along highly differentiated and specific causal pathways, for many of which there are no well-defined theories. All this demands a holistic health planning approach entailing greater collaboration between epidemiological sub-disciplines and associative and cause-effect models functional at each spatial scale, thereby facilitating efficient multilevel theory, empirical models and interventions.

The time axis of the health niche paradigm in Figure 3.1 represents the need to take in to account temporal progression, phases and hierarchies (from 'life stage' to 'life course') for a more scientifically robust explanation of disease causation. It has now been generally scientifically established that chronic diseases are characterized by long latency and evolve over a life-time through cumulative interactive processes. Several studies have highlighted the associations between early life exposures to risk factors (in the form of unhygienic diets, deprivation and vascular risks) and subsequent higher risks of mortality in adulthood (Forsdahl, 1977, Lauer et al., 1988, Barker, 1994). A temporally dynamic life-course model of disease based on long-term cohort studies can trace disease etiology over a life course encompassing in-utero, infancy, childhood, adulthood and geriatric phases (Kuh and Ben-Shlomo, 2004, Ben-Shlomo and Kuh, 2002).

## Health of an individual is thus a function of the spatio-temporal variations in the corresponding urban health niche.

Epidemiological studies should thus not only be based on cohort data relating to risk factors and health outcome variables, but also on prospective data representative of variations in the triad of social, natural and built environmental causal and moderating factors.

Furthermore, the urban health niche framework takes in to account the multiple levels of aggregation at which health data is produced, distributed and studied. Thus as one moves from the individual level to a higher level of organization, a collection of individuals may come together to constitute a population. The population may range from a set of individuals living in a city to specific demographic or behavioural groups such as older adults, children, smokers etc. Each population is characterized by its unique culture, structure, economic and social form. The sub-set of individuals residing in a neighbourhood or any other spatial unit is characterized by specific environmental (built and natural), spatial, social, cultural and individual preference structures. Individual health niches selforganize, re-configuring one another and intertwining together to constitute the coalesced niche for the population. As a result of the coalescence of individual spatially explicit urban health niches, diverse individual susceptibilities and exposures are interlinked together to produce universally configured group effects acting upon the constituent individuals' health, which gives rise to overall population level risk facors and health continuum (Rose, 1985). Once the coalesced niche for the population is formed, such aggregates in effect configure individual health niches and thereby influence individual health outcomes and vice versa. In other words, the manifested health of individuals and populations are an emergent and self-organizing phenomenon arising from the spatiotemporal variations in individual urban health niches and the corresponding population aggregates. To use an analogy, neighbourhood-level health niches can be assumed to self-organize in relation to each other in the same way that self-organize; with changes in one neighbourhood housing markets neighbourhood spilling over in unpredictable non-linear ways to adjacent submarkets and affecting changes in distant locations and in the overall systemic urban land economy (a comparison with Nobel economics laureate Thomas

Schelling's tipping model of urban social mix would be a worthwhile extension to the idea of urban Health Niches (Schelling, 1971, Schelling, 2006).

As a classic example of health niche self-organization, higher prevalence rates of a particular disease observed in populations belonging to a specific ethnic minority may have individual- and population-level causes. The intrinsic individual health niche may comprise biologic factors (such as genetic predispositions and physiologic and immunologic factors), lifestyle as well as social, natural and built environmental factors in the neighbourhood level. At a population level, there may be spatial clusters of ethnic minority, all predisposed to similar lifestyles or occupation and hence exposed to similar behavioural and occupational health hazards. Furthermore, causative factors are generally associated with quality of governance, prevailing planning and policy measures as well as devised intervention strategies. For example in inner city neighbourhoods, it may often be seen that lack of diversification often results in cultural exclusion and social deprivation in the clusters and such neighbourhoods may be characterized by physical decline and lack of basic services.

Hence, the coalesced niche of the population/region not only manifests the characteristics of the individual level niches but also the aggregated effects of occupational hazards, cultural exclusion, social deprivation as well as neighbourhood physical decline which often tend to enhance the degree of exposure to risk factors as well as exacerbate their effects on health. In other words there exists a bi-directional and reciprocal association between individual and coalesced urban health niches that configure each other so that their spatiotemporal variations produce corresponding variations in the individual health and population health continuums. It is acknowledged that the boundaries between the upper levels of the hierarchy are often fuzzy; with no standard guidelines to what constitutes the standard size of a population, community or a region; and

this is therefore a productive research frontier. The exploration of spatial scale in my empirical chapters later on in this thesis contribute to pushing back this frontier and offers a new methodology for such studies.

Such an integrated approach that gives due credence to existing spatial and organizational hierarchies provides urban as well as public health planners with an effective way to assimilate research outputs derived from the various epidemiological sub-disciplines and thereby devise intervention mechanisms and policy across each of the spatial as well as organizational hierarchies.

Rose (2001), noted that the causes of illness at an individual level may be quite different from that at a population level, wherein it emerges as a result of intrinsic characteristics of the component individual as well as interactions and interdependencies between them. Consequently, different policy and intervention strategies are necessary at the individual and population levels.

#### 3.3 Urban health niche based healthy city model

Studies aiming to explore contextual effects of the built environment upon individual behaviour and health have increasingly pointed to the conceptual and methodological challenges inherent in doing so (Galea et al., 2010, Galea et al., 2009, Auchincloss and Diez Roux, 2008). The risk factors operating at multiple spatial scales and levels of organization are often interdependent and it is highly unlikely that causality is unidirectional and continuous in nature. It is often neglected that individuals select their neighbourhoods on the basis of personal preference, based on socio-economic constraints, perceived degree of satisfaction and so on and these so called *migration effects* confound causal reason and interpretation in cross sectional and case study investigations. Furthermore, the effects are cumulative in nature. Individuals may adapt their behaviour according to the characteristics of the social cluster/population they belong to or according to the environmental habitat they occupy. Similarly, as I

have noted, individuals and population as well as the neighbourhoods configure one another, each adapting in response to the others. In order to overcome these constraints, several recent researches have espoused the adoption of systemic approach to healthy city planning (ICSU., 2012, Rydin et al., 2012). In this section, I conceptualize a health niche based systemic healthy city planning model employing.

Building upon the urban health niche paradigm already described, I introduce a holistic healthy city planning model, illustrated in Figure 3.2. The model conceptualizes the healthy city to be composed of three parallel co-existing systems.

Firstly, the individual - population system; where the health outcomes are manifested. An individual may be construed as comprising tissues, cells and genes, while populations comprise several individuals and so.

Secondly, the household - neighbourhood - city system; where health determinants function at identifiable different spatial, behavioural and organizational scales. The household space may comprise several components like floor area, heat, light, amenities etc, while neighbourhoods constitute multiple households, streets, amenities and so on.

The third type of system is the governance and decision making systems, ranging from local to regional governance hierarchies and their associated land, services and health planning competences. Thus, the health of an individual is an outcome of the interactive causal processes connecting the components of these three categories of systems. As has been discussed earlier, the causality is non-linear and bi-directional with feedback loops (Pearce and Merletti, 2006). An integrative approach enables efficient way to conceptualize inherent complexities in a healthy city system. This further enables us to unravel the underlying multiple causal pathways connecting the various agents of component systems (ICSU., 2012).



Figure 3.2a. Health niche based model of healthy city.

Hierarchy	Determinant code	Health-defining factors
	RL1	Governance
Regional level	RL2	Macroeconomics
	RL3	Social ideologies (democracy, human rights, racism,
		customs)
	RL4	Urban regeneration
	RL5	Sprawl, suburbanization, immigration
	RL6	Biodiversity, natural habitats, climate stability/change
	CS1	Route morphometrics (city-wide network connectivity
City level		/accessibility)
	CS2	City-wide land use dynamics (location & density of service
		destinations)
	CS3	Transport (role of active transport, policies)
	CS4	Governance & enforcement regulations
	CS5	Microeconomic structure
	CS6	Labour market, agricultural market & food network
	CS7	Educational system, health services, welfare benefits, etc
	CS8	Pollution, waste disposal, aesthetics
	NS1	Route morphometrics (network connectivity /accessibility)
Neighbourhood level	NS2	Land use morphometrics (density & proximity of service destinations)
	NS3	Residential density
	NS4	Design (pedestrian friendly design)
	NS5	Neighbourhood socio-economic status
	NS6	Social capital, sense of community
	NS7	Safety (crime rates, graffiti, road safety)
	HS1	Household type, tenure, floor level and household
Housing space/	1	overcrowding
Work place	HS2	Household income/wealth, amenities
	HS3	Sanitation & household pollution levels (indoor pollution, noise levels)
	HS4	Physical conditions (lighting, dampness, sunlight hours,
		average individual space etc)
	HS5	Social bonds, social support, living arrangement
	HS6	Nutrition & diet, hygiene
	HS7	Life style (Sleep hours, smoking, drinking, addiction, physical activity)
	IL1	Age, gender, ethnicity
Individual level	IL2	Education, employment
	IL3	Physiologic factors (allergic reactions, immunologic competence, drug reactivity, exposure to pathogens, etc.)
	IL4	Genotype
	IL5	Nature of responses to prevailing psychosocial factors
	IL6	Birth defects, accidents and disabling Injuries

Figure 3.2b. Multiple multilevel health defining factors in the healthy city model.

The existing spatial scales in the model are represented as the '*urban hierarchy cone*'; comprising a hierarchy of functional spatial aggregates: household space, several households within neighbourhoods; neighbourhoods clustered into cities, which combine together to form regional aggregates. As we move up the levels, the cones have increasing surface area and yet all originate from the same base; reflecting the idea that individuals form the basic building blocks of the urban system. In an analytic sense, the household - neighbourhood - city (HNC) system comprises two categories of causal factors. The physical environment are constituted by natural as well as built environment factors, while the social environment is formed as clusters of individual (populations), forming cohesive networks with well defined social structures maintained by flows of social capital, economics and information.

Corresponding to the spatial scale, there exist a well defined hierarchy for devising health-enhancing interventions. This has been represented in the model by a set of concentric 'cylinders of integrated planning'. These governance and decision making systems comprise factors such as policy constraints and interventions at each level which impact the health of an individual and at population levels. In terms of urban theory, they roughly divide into public services, physical infrastructure, regulations and educational interventions aimed at changing behavior. In the empirical models in later chapters, physical infrastructure (the urban road grid) is considered to assume a crucial role in health by virtue of its function of distributing to individuals the benefits of collective health-promoting investments.

The model suggests that healthy city planning requires that interventions that are guided by considerations at each level of ecological hierarchy. Thus the regional-level health planning initiatives should essentially originate from the individual-level and go on to the household, community and subsequently, the

city level, thereby assimilating all the determining factors at each spatial hierarchy. This will essentially demand more effective multi-agency and interdisciplinary collaborations between the disciplines of biomedicine, epidemiology, public health and urban planning.

Following WHO (WHO., 2005a), the healthy city model conceptualizes the health of an individual to be a function of three components. Physiological health may be measured in terms of presence/absence of infectious, chronic as well as life threatening diseases. Mental health may be measured in terms of prevalence of common psychiatric disorders including depression, anxiety and cognitive impairment. Social health is essentially governed by the degree of social support and connectivity enjoyed an individual, thereby encouraging/prohibiting social interactions with behavioural and health effects. Social health is dependent upon a number of factors in the social environment such as living arrangement, social bondage, social capital as well as degree of well being (efficacy, self-esteem, life satisfaction, positive affects etc).

Spatially, an individual occupies the common edge of three enveloping cubes, each successively increasing in area, reflecting the spatial hierarchy of econiches in which it is located. The first cube in Figure 3.2 indicates the household/work space, representing the entire household (or office or unit in an industrial building). The second cube, enveloping the building space, is the neighbourhood space, of which the dwelling unit (office or factory) forms a part. The third cube represents the city space, that is, the cityscape of which the neighbourhood forms a component. The Health Niche is conceptualised this way following a long tradition in urban economic, social and planning theory that consistently identifies the neighbourhood as a distinct unit of functional and behavioural organisation linking individuals and households with the wider urban system (Webster, 2003). An alternative would be to conceptualise the spatial

dimension of the model as a continuum, assuming that neighbourhood and population effects vary continuously rather than discretely. The truth is that both happen: both continuous and discrete functions may best describe the impact of spatially-sensitive factors on individual health. In my empirical models, this is captured, for example, by the use of continuous variables within discretely defined neighbourhood buffers.

Each individual is thus enveloped by a hypothetical hypervolume, coined as the *intrinsic health niche* at a given instant of time, which is a composite of all the predictor factors in an urban system that interact synergistically to produce the health of an individual. Variations in the health of individuals are deemed to be a result of spatio-temporal variations in health niches. As has been described earlier in this Chapter, individual niches coalesce to constitute population niches so that we have individual-population systems that co-configure one another. The urban health niche of an individual at a given space-time coordinate (x, y, t) may thus be conceptualized to comprise multiple factors that interact synergistically to produce health outcomes and continuums at individual and population levels respectively.

In sum, I conceptualize a *health niche* as the fundamental component of a *healthy city* model. It is self-emergent, essentially a function of interactions between multiple factors divided in to three constituent components; namely, intrinsic-individual-, meso-environment- and macro-environment-level factors. The micro-level factors comprise the inherent within-individual biogenic factors that govern the nature and degree to which an individual reacts to the surrounding environment, thereby defining the degree of risk or proneness to a particular health risk. These may include individual-level health-defining factors that are unique to a particular individual like age, gender, ethnicity, genotype; physiological agents such as allergic reaction, immunologic competence, drug

reactivity, levels of exposure to pathogens etc; psychosocial agents measured by levels of psychological distress, delinquency; and experience of life events, accidents and disabling injuries.

The meso-environmental factors of the health niche typically comprise the health-defining factors of dwelling place and work space. They may include physical factors associated with sanitation, pollution (indoor, noise), physical conditions (lighting, dampness, sunlight hours, average individual space, floor level etc), amenities and heating (Howden-Chapmam, 2004) as well as socio-demographic and lifestyle-level factors such as education, income, family bonding and support, nutrition, smoking, etc.

The meso-environmental factors assume particular importance especially in high density and impoverished families. It is common to find several individual family members occupying a single room in high-density suburban and rural neighbourhoods of India, for example, often lacking proper ventilation and without adequate sanitary facilities. The tendency to depend upon biomass and coal as the primal energy source for household needs especially cooking and heating further aggravates the situation for many of the world's poor (Smith, 2002). At the onset of respiratory disorder in an individual, such micro-environmental factors may further exacerbate the condition into chronic asthma. Household overcrowding has the potential to make an individual more prone to exposure to the pathogens of infectious diseases if another family member falls ill (Kellett, 1993, Fonseca et al., 1996) as well as cause stress of enforced involuntary social interactions (Evans and Lepore, 1993). Set against these increase risks, increased interpersonal contact may result in enhanced social capital and support. Poverty in the West is more likely to be associated with a microenvironment such as cold and damp housing infested with spores of fungi (Burr et al., 1981, Martin et al., 1987, Billings and Howard, 1998). In the work

environment, occupational health hazards originate from agents of air, water, noise, thermal and radioactive pollution, as well as interpersonal contacts. A worker vulnerable to cardiovascular risk factors in the work environment (such as having high blood pressure and spending 40 hours a week working in front of a blast furnace and exposed to thermal and noise pollution) will be more likely to have work-related anxiety, cardiovascular disease and other related chronic disorders (Landsbergis et al., 2003).

An individual spends most of the time in the house or work place, the spatial location of which determines the attributes of the individual macro-environment. The macro-environment factors are active at scales of neighbourhood, city and region. An individual residing in a household located in a spatially well-integrated neighbourhood and city may enjoy the health benefits of:

- an optimised density of health-promoting resources,
- an optimised mix of land uses in its neighbourhood,
- a street configuration conductive to walkability
- more dense social network and levels of social capital
- greater density of accessible welfare-enhancing destinations

All these may together define accessibility within an urban system as well as in the social networks constituted facilitated and accommodated within it and their role in influencing health behaviour and eventually health is reviewed in detail in Chapter 4.

The overall urban health niche enveloping an individual in a city is also shaped by a self-organizing arrangement of people, activities and places. Individuals locate to optimise distances between other individuals with whom they wish to cooperate in pursuit of wealth and welfare, work, daily subsistence and leisure. As individuals populate a built environment niche they change the ecology of a city and affect the location calculus of other individuals. Health facilities like other services locate in certain places because of the accessibility of those places to target users and customers. In turn, a distribution of facilities and services will, affect the location and movement behaviour of other individuals. As a result of this iterative process by which individuals respond to accessibility and thereby modify accessibility, a city's accessibility 'surface' (a mathematical model describing various kinds of accessibility at each location or each link in the network – formally defined and implemented empirically in Chapters 5-8) is a rich source of information. Given that the spatial behaviour of individuals, including home, work and other activity location, is influenced by multiple distance optimisation criteria in multiple time periods, there is *a priori* reason to view an urban accessibility surface as some kind of aggregate indicator of locational benefits. This is the outworking of Figure 3.2 that I develop in the empirical work of this thesis.

Other macro-environment factors influencing health may also include those associated with the quality of natural environment such as proximity to highly polluted sites. Residents living adjacent to major roads may be prone to negative health effects of poor air quality and elevated noise levels from traffic flows (Kunzli et al., 2000, Brauer et al., 2002, Stansfeld et al., 1996, Stansfeld and Matheson, 2003), while residents living in the vicinity of major industrial sites generally have a higher propensity to suffer from chronic disease on account factors causing pollution of air and water (Ginns and Gatrell, 1996, Elliott et al., 1999, Corcoran et al., 2010, Drechsel et al., 2010). Other health-defining factors include those related to amount of urban green (de Vries et al., 2003, Lachowycz and Jones, 2011, Dadvand et al., 2012), electromagnetic fields (Knave, 1994, Röösli, 2008), urban heat island effects (Tan et al., 2010), as well as those functioning at regional scale such as climate change (McGeehin and Mirabelli,

2001, Patz et al., 2005, McMichael et al., 2006). Aesthetic neighbourhood quality related to physical manifestations of incivilities and territorial dysfunctioning, defensible space and fear of crime have been shown to influence health (Newman, 1972, Taylor, 1988, Weich et al., 2002, Cohen et al., 2000, Stafford et al., 2007a). And of course, the role of neighbourhood-level socio-economic status is, as I noted in the previous Chapter, one of the longest-studied macro-influences on health-related behaviour and health outcomes (Pickett and Pearl, 2001). What the model described above adds to this well-founded field is an overarching conceptual framework that recognises complexity in scales and times of interactions and causation; and provides a theoretical basis for empirical models of multi-scalar, multi-dimensional and multi-temporal associations between the built-environment and health.

#### 3.4 Conclusion

The proposed urban health niche paradigm follows a holistic and multidisciplinary approach to studying public health and healthy city. The objective is to unravel the black box of contextual determinants of health. The potential of such an approach stems from its effectiveness in organizing and integrating prospective data across the multiple sub-disciples encompassing clinical medicine, genetic epidemiology, risk factor epidemiology, social epidemiology, epidemiology of built and physical environments as well as urban planning and public health planning. It thereby facilitates multi-disciplinary empirical research by accessing data across multiple and multi-level health-defining factors as well as helps disseminate such research through formulation of multilevel policies and intervention strategies.

The gene-behaviour-environment (natural and built) interaction model recognizes the role of genotypic distribution in affecting spatial variations in

health behaviour and disease. At the same time, the role of contextual social, built and natural environmental factors in disease causation is determined by an individual's genetic makeup. Only an integrated approach to study the dual role of genotype as well as context (encompassing micro to macro levels) will enable us to decipher the causal inference in disease causation (Diez Roux, 2007).

The urban health niche is not a static hypothetical space surrounding the individual; it varies in space and time coordinates, in response to the individual's behavioural pattern within urban space. Thus, medical geographers may be interested in the spatio-temporal dynamics of personal behavioural patterns, defined by the multiple multilevel factors and often unique to each individual. They can be captured by a diurnal space-time activity graph. The maximum convex polygon, the smallest convex polygon comprising of a set of point events may be employed to examine the association between urban morphology and individual activity patterns (Buliung and Kanaroglou, 2006, Moorcroft and Lewis, 2006). Similarly kernel density estimation may be employed to conceptualize space-time utilization of health-promoting services as well as the spatio-temporal distribution of diseases (Bithell, 2006). Other sophisticated technologies such as network based space-time prisms or isochrones may enable us to operationalize the diurnal trace of individuals' behavioural niches within a network (Neutens et al., 2008). An effective collaboration between medical geographers and clinical practitioners will enable us to examine the nature of association between health outcomes and context-based behavioural data derived from these technologies. At a longer time scale, an effective multi-disciplinary approach will help examine cumulative contextual health effects through collaborative use of cohort data relating to risk factors and health outcome as well as prospective data pertaining to variations in social, natural and built environment context. The author is a coinvestigator on a study, about to start at the time of writing, funded by the UK

Biobank, that will create a unique database structured along the lines of the Urban Health Niche model described in this chapter and facilitating models that explicitly analysis health impacts from genetic to macro-built-environment scales.

At a macro-level, urban and public health planners must strive to formulate evidence-based plans and policies. This can be possible only through effective understanding by epidemiologists of the complex dynamic interactions from micro to macro levels. As an example, city level health intervention strategies can be devised by urban planners based on prior retrospective epidemiological studies of the long term health effects of urban regeneration and retrofitting at neighbourhood and city scales. Such informed spatial planning should guide city and regional level policies with respect to housing, land use, transport thereby enabling optimization of health-defining services.

The proposed urban health niche based healthy city model also highlights the inherent complexity involved in the socio-spatial production of health in a city. The risk factors operating at multiple spatial scales and levels of organization are often interdependent and it is highly unlikely that causality is unidirectional and continuous in nature. It is also neglected that individuals may select their neighbourhoods on the basis of personal preference, based on socio-economic constraints, perceived degree of satisfaction and so on and these so called *migration effects* confound causal reason and interpretation in cross sectional and case study investigations. Furthermore, the effects are cumulative in nature. Individuals may adapt their behaviour according to the environmental habitat they occupy. Similarly, as I have noted, individuals and population as well as the neighbourhoods configure one another, each adapting in response to the others. Such methodological challenges in developing reliable knowledge about complex dynamic non-linear interactions between causal factors (both at individual and

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population levels as well as prevalent at multiple spatial scales); bi-directional causality; discontinuous relationships over time, and so on have led to led some epidemiologists to test the potential applicability of more explicitly complex approaches such as agent-based complex adaptive systems (CAS) models. In recent years a few epidemiologists have advocated the application of a complex adaptive system based approaches to epidemiology (Koopman and Lynch, 1999, Materia and Baglio, 2005, Pearce and Merletti, 2006, Galea et al., 2010, Diez Roux, 2007, Auchincloss and Diez Roux, 2008). However, this is still an emerging area of research in contemporary epidemiology and the challenge that lies ahead is to find ways to operationalize an integrated approach - combining the predictive and explanatory powers of statistical models with causal inferential powers gained from CAS based models.

# Chapter 4: Spatial determinants of health

This chapter comprises a systematic review of epidemiologic literature on spatial built environment and health along the lines of the proposed spatially explicit urban health niche model of Chapter 3. Key determinants of health at the housing and neighbourhood levels are discussed in detail.

## 4.1 Factorising the housing-level determinants of physical health

The relationship between residential environment and health is multi-dimensional and complex in nature. Although, there has always been a symbolic recognition of this relationship, very little deciphered quantitative evidence exists regarding its exact nature. The importance of quality and quantity of *Housing* for urban health has been recently emphasised by the United Nations Human Settlement Programme (UN Habitat), which estimates that approximately one billion people out of a global population of six billion are presently living in slum like conditions and that this figure is expected to double to two billion by 2030. In recognition of this, UN Habitat holistically defines adequate housing as:

"...accommodation associated with attributes of privacy; adequate space; physical accessibility; security; security of tenure; structural stability and durability; adequate lighting, heating and ventilation; adequate basic infrastructure such as water supply, sanitation and waste management facilities; suitable environmental quality and health-related factors; and adequate and accessible location with regard to work and basic facilities: all of which should be

available at an affordable cost" (United Nations Commission on Human Settlements., 1996).

The associations between housing, socio-economic conditions and health outcomes are complex. Housing space provides the immediate microenvironment where individuals in urban populations spend more than 80 percent of their time (Leech et al., 2002). The figure is currently close to 16 hours daily for the developed countries, a figure that is likely to increase in the coming decade with current policies aiming to minimize dependence upon urban transportation and encouraging working from home. A housing unit is characterized by a set of physical conditions which constitutes the health-influencing biochemical factors to which each individual is exposed. Housing units differ in their ability to shield us from exposure to adverse climatic conditions, vectors of pathogens and pollutants. Every house has a unique set of personal and household hygienerelated attributes such as dampness, lighting, indoor pollution, supply of potable water, sanitation, waste disposal, storage, space and methods of food storage and preparation and so on (WHO., 1990). Houses provide an environment for the household economy: for making things, consuming things and disposing of things. These activities carry various types of health risks that are mitigated or enhanced by the configuration of internal and external space.

Residential units also provide us with the private space for relaxing, interacting and developing social relationships within a family. Housing environments can foster social bonds, support specific living arrangements and alleviate psychological stress processes. There is a plausible connection therefore between a household's micro environment and the mental health of individuals (Halpern, 1995). The amount of space and the levels of comfort available percapita generally depend upon the socio-economic status of residents. The physical structure of housing in terms of building design and quality of materials used as well as the attributes of the indoor environment directly influences the health of residents. Poor quality construction increase risk of accidental injuries, dampness and protection from natural elements and man-made pollutants for example.

Housing should not be considered in isolation but as building blocks of neighbourhoods, communities and the city as a whole. At this level, the density, the location of a dwelling in the overall emerging urban matrix, and the presence of externalities from proximate land uses all have an indirect influence upon the health of a house's occupants.

Healy (2003) performed an assessment of health-defining housing conditions, levels of energy-efficiency, affordability and degree of satisfaction with housing in 14 European countries using longitudinal datasets from the European Community Household Panel over the period 1994–97. Serious housing deficiencies in the form of poor thermal efficiency, high fuel poverty, burdensome housing costs and low housing-satisfaction rates were identified as the key health-inhibiting factors in Southern Europe. While, in northern Europe, dampness and overcrowding was identified as the health-inhibiting factors, especially in the UK, Ireland, France and Belgium (Figures 3.1 and 3.2). There has been a spate of research over the last two decades identifying the physical and mental health problems associated with inadequate house conditions. These include respiratory tract infection, asthma, pulmonary disease, lung cancer, cardiovascular diseases, anxiety, depression, attention deficit disorders, aggressive behaviour, substance abuse, obesity and so-called sick building syndrome (Raffestin, 1990, Fullilove and Fullilove III, 2000, Fisk, 2001, Howden-Chapmam, 2004). I look at particular housing-related causes in the following sections, denoting the principle hypothesized causes as Factors with notations H1...Hn from the health niche based healthy city model (described in Figure 3.2).

	Per cent Detached	Per cent Semi- detached/ Terraced	Per cent Small MFDs	Per cent Large MFDs	Per cent Owner occupier	Per cent Tenants	Per cent Rent- free
Germany	26.0	13.4	34.3	18.8	42.3	54.4	3.2
Denmark	50.2	12.6	12.7	19.2	62.5	37.0	0.5
Netherlands	13.0	51.8	4.4	18.1	52.1	47.0	1.0
Belgium	33.9	42.0	11.1	7.7	67.7	28.9	3.4
Luxembourg	38.1	30.8	19.1	10.1	72.2	24.7	3.1
France	38.6	21.4	13.3	24.5	56.5	38.1	5.4
UK	22.5	58.8	11.3	3.9	68.4	28.3	1.6
Ireland	51.0	42.9	2.3	0.9	85.8	13.3	1.8
Italy	20.2	12.1	37.3	23.5	74.0	19.1	6.9
Greece	31.8	19.0	29.3	18.4	78.7	17.9	3.4
Spain	17.5	19.2	18.8	43.8	80.7	12.9	6.4
Portugal	51.1	26.7	13.8	4.9	68.5	20.0	11.5
Austria	47.9	4.5	11.8	27.6	58.7	34.6	6.6
Finland	47.2	17.6	2.4	30.0	73.8	16.9	9.2

**Table 4.1.** Dwelling type and tenure in Europe – mean percent, 1994-1997 (Healy, 2003, pg 414).

**Table 4.2.** Household with housing problems – mean percent, 1994-1997 (Healy, 2003, pg. 417).

	Leaky roofs	No hot running water	Objective overcrowding	Subjective overcrowding	Damp	Rot
Germany	4.3	4.6	9.4	15.0	7.9	5.3
Denmark	3.9	0.8	5.0	16.0	6.2	5.6
Netherlands	4.4	0.5	_	9.8	10.8	9.7
Belgium	5.7	3.6	5.0	14.6	14.4	9.1
Luxembourg	5.0	3.1	8.4	11.5	7.5	4.8
France	5.3	2	8.2	13.6	16.3	10.4
UK	3.8	0.2	5.2	18.0	13.0	12.7
Ireland	4.1	4	14.8	12.5	9.6	7.3
Italy	6.3	2.8	24.3	19.9	5.4	6.2
Greece	16.4	70.2	_	26.9	18.8	9.3
Spain	11.4	3.5	15.8	21.6	21.5	7.6
Portugal	18.7	22.6	19.9	27.9	33.4	25.2
Austria	3.6	2.4	_	14.1	8.8	4.6
Finland	2.9	1.8	13.3	15.3	3.8	2.6

#### 4.1.1 Factor H1: Cold, damp dwellings and physical health

Residential units maintained at proper temperatures provide comfort to occupants and foster good health. The optimal temperature for maximum comfort varies between climate zone, individuals, age groups, as well as levels of fitness and physical activity of occupants. The World Health Organization recommends a minimum indoor temperature of 20°C for the sick, handicapped, very old and the very young (WHO., 1987), based on research into the effects of temperatures on expressed and revealed wellbeing. There is a general consensus that there exist an enhanced chance of respiratory impairment at a temperature below 16°C, cardio-vascular strain below 12°C and hypothermia at temperatures below 6°C (Collins, 1993). Furthermore, cold and damp domestic environments are often found in conjunction with each other as insufficient heat encourages condensation which in turn promotes the growth of pathogens and hence compromises the health of the occupants. In a study conducted on 858 respondents in Western Scotland. Gemmell (2001) highlighted the relationships between socioeconomic factors, house conditions, inadequate home heating and poor health in respondents of Western Scotland aged 55-60. As mentioned in the earlier section, the associations between poor quality housing, fuel poverty and disease outcomes has long been identified (Rudge, 2000, Healy, 2003). Ireland and the UK exhibit the highest rates of seasonal mortality in northern Europe on account of inadequately protected and thermally inefficient housing; especially from myocardial infarction, strokes and respiratory conditions (BMJ., 1980, Curwen, 1991, Healy, 2003). In Great Britain there is considerable maldistribution of decent housing; often termed as "inverse housing law", which implies that those areas prone to a colder climate are the ones that tend to have worse housing conditions. An estimated 40,000 extra winter deaths occur each year in Great Britain between the months of December and March primarily

attributable to poor housing quality and deprivation (Aylin et al., 2001). Increased rates of morbidity in inadequately heated homes may be attributed to bronchospasm (which in turn has been independently identified as being triggered by smoking), upper respiratory tract infections, and cardiovascular diseases (WHO., 1987, Blane et al., 2000, Evans et al., 2000b, Mitchell et al., 2002).

#### 4.1.2 Factor H2: Damp, mould and physical health

Damp conditions are associated with high moisture levels and can harbour pathogens that can be damaging to health. In most dwellings, dampness results primarily from water leakage. Viral and bacterial infections are long known to be more prevalent in damp houses (Karim et al., 1985). Damp in the form of condensation provides a breeding ground for the germinating spores of mould fungi. They form saprophytic colonies on plugs of mucus producing lesions in respiratory tissues. They further act as respiratory allergens causing rhinitis, alveolitis, and asthma (Hosen, 1978, Platt et al., 1989, Martin et al., 1987). Burr et al. (1981) in their study conducted on men and women aged 20-44 in South Wales highlighted the associations between coal fires, dampness and respiratory diseases. Martin et al. (1987) conducted a study on the effect of damp on ill health for one postcode sector of Edinburgh (with over 2000 dwellings). The study defined a "damp house" in terms of the degree of damp, condensation, or fungal mould present. A significant association between living in a damp, and more specifically, "mouldy" house, and ill health was reported among children. In addition to respiratory problems, other symptoms of infections and stress were also reported to be more prevalent among children residing in damp houses. The positive relationship between damp and mouldy housing and recurrent headaches, fever, nausea and vomiting, and sore throats are well established

(Platt et al., 1989, Institute of Medicine., 2000). Howden-Chapman et al. (2008) reported negative associations between improved residential heating and the incidences of asthma among children. Dedman et al. (2001) conducted a life-course study of the association between their five categories of housing variables (crowding index, water supply, toilet facilities, ventilation and cleanliness) during childhood and later life mortality from all-causes and from coronary heart disease, stroke and cancer. The study was carried out in 16 survey areas of England and Scotland and comprised 4301 people. Their evidence suggested that on the whole, respondents living in better quality housing had lower odds of mortality. Subsequent to adjustments for childhood and adult socioeconomic factors, lack of private indoor tapped water supply was significantly associated with increased mortality from coronary heart disease, while poor ventilation was associated with higher odds of overall mortality. A positive association between damp dwelling and the incidences of asthma has been found in several other studies (Billings and Howard, 1998, Institute of Medicine., 2000).

#### 4.1.3 Factor H3: Overcrowding and physical health

Overcrowding is associated with lack of privacy and stress contributing to both physical and mental illness and increased accident incidences. Several measures have been developed to quantify overcrowding within a household. Objective overcrowding is measured as the total number of residents in the household divided by the number of habitable rooms in it (excluding kitchens, bathrooms, halls, garages, etc). As per the standard definition of overcrowding, a value greater than one is considered as '*objectively overcrowded*' (Eurostat., 1996). A more intricate measure is the Canadian Overcrowding Index (Canada Mortgage and Housing Corporation., 1991). For residential apartments, building density (persons or dwelling units per structure) has been identified as one of three types

of population density and essentially indicates the degree of separation of households from each other by the walls, floors, and ceilings they share and is an important measure of overcrowding. It acts as an important predictor of mental strain.

Overcrowding have long been associated with higher premature mortality rates as well as enhanced risk of both infectious and non-infectious diseases (Kellett, 1993). There have been reported associations between overcrowding and enhanced incidences of meningoccocal disease (Baker et al., 2000), higher propensity of infections of the respiratory tract, both viral or bacterial (Graham, 1990, Murtagh et al., 1993, Fonseca et al., 1996, Marsh et al., 1999), tuberculosis (Stein, 1950, Coetzee et al., 1988), and hepatitis B (Milne et al., 1987). Overcrowding in conjunction with inadequate ventilation poses more potential risks as it increases the moisture levels of the indoor environment; thereby providing nurturing grounds for mites, roaches, respiratory viruses, and moulds, all of which play a role in respiratory disease pathogenesis (Markus, 1993, Bierman, 1996, Billings and Howard, 1998).

### 4.1.4 Factor H4: Housing disrepair, pest infestation and physical health

Residents of substandard housing in impoverished neighbourhoods are disproportionately exposed to allergens, pests, air pollutant and hence are prone to greater health risks. Pest infestation in dilapidated dwellings is a common occurrence and is primarily related to structural defects. Housing disrepair and structural defects contribute to easy admission of pest like mites, cockroaches and rodents. Structural defects in the form of leaking pipes, cracks and holes in ceilings, dead spaces within walls permit the entry of pests. Dysfunctional food storage and waste disposal facilities provide them with space and water for their sustenance (Howard, 1993). Pests have long been known to have an aggravating influence on asthma. Cockroaches may cause allergic sensitization acting as trigger for asthma. Studies have shown that exposure to cockroaches especially aggravates the condition of asthmatic children, making them prone hospitalization (Rosenstreich et al., 1997). Mouse allergen has also been known to act as a clinically important agent of allergy that enhances vulnerability to asthma (Phipatanakul et al., 2000). Several other studies have reported increased risk of developing asthma in the presence of dust mite allergens (Institute of Medicine., 2000, Raw et al., 2001). Furthermore, the use of pesticides in dilapidated houses may pose considerable health risks (Cummins and Jackson, 2001, Krieger and Higgins, 2002). Small clinically controlled studies have reported an association between the occurrences of bronchoconstriction and the use of insecticides that contain pyrethrin as well as the use of perfumes (Salome et al., 2000). Another commonly observed characteristic of substandard dwelling is the presence of old, damp and dirty carpeting which often acts as breeding grounds for dust, allergens and toxic chemicals. These agents often act as a trigger to allergic, respiratory, neurological, and hematologic illnesses (Roberts and Dickey, 1995, Vaughan and Platts-Mills, 2000). Some studies have reported that dilapidated housing may in itself act as a stressor that affects the human immune system (Lehmann et al., 2002).

#### 4.1.5 Factor H5: Indoor air pollution and physical health

Indoor air quality has long been identified as an important determinant of health. Choice of building materials, furnishings, cleaning agents, selection of energy and fuel efficient devices for indoor heating and cooking needs, operating an effective ventilation system and environmental tobacco smoke all determine the levels of indoor pollution in a dwelling (Hodgson, 2002).

Household combustion products primarily comprise carbon dioxide, carbon monoxide, sulphur dioxide and nitrogen dioxide. Carbon dioxide (CO<sub>2</sub>) itself is not considered a pollutant and poses no health concern. However, the  $CO_2$  levels inside an occupied building, in the absence of any combustion, should not exceed 650 ppm above ambient levels; often CO<sub>2</sub> levels are employed as indicator of the degree of ventilation in a facility (Zhang and Smith, 2003). In addition to the combustion of solid fuels, gaseous fuels used in common household devices also act as sources of pollution, including particulate matter (PM), CO<sub>2</sub>, eye irritating volatile organic compounds (e.g. aldehydes), and carcinogenic compounds such as benzene and 1,3-butidiene and polycyclic aromatic hydrocarbons, although at comparatively lower concentration. Typically, health risks multiply many-fold in cases of incomplete combustion products of solid fuels burnt in poorly designed and maintained stoves. These include carbon monoxide (CO) and respirable particulate matter and various categories of volatile organic compounds (VOCs) and semi-volatile organic compounds (SVOCs) and have been known to be posing many acute and chronic health risks (Zhang and Smith, 1996, Zhang et al., 2000, Zhang and Smith, 2003). Health risks from CO arise in cases of acute exposure to very high concentrations from unvented combustion heaters and charcoal fuel, resulting in poisoning fatalities worldwide. Moderately elevated levels of CO have been associated with headaches (Girman et al., 1998, Walker and Hay, 1999). Cases of carbon monoxide poisoning are further exacerbated by inadequate or faulty ventilation systems. On the contrary, sustained contact with nitrogen dioxide  $(NO_2)$  emitted from gas and oil operated furnaces and stoves have been reported to pose modest risk for respiratory diseases compared to their electric counterparts (Neas et al., 1991, Basu, 1999). In a study conducted by Jenkins et al. (1999) short exposure to high concentrations of nitrogen dioxide enhances allergen sensitivity, thereby causing enhanced bronchial responsiveness to inhaled allergens in a

dose-sensitized population of asthmatics. There is increasing medical evidence that the smoke enamanating from solid fuels is the potential culprit for ailments as serious as acute respiratory infections (ARI), chronic obstructive pulmonary disease (COPD) and lung cancer (from coal smoke) (Smith, 2002, Zhang and Smith, 2003). Indoor smoke from solid fuels has been identified as one of the top ten risk factors for the global burden of disease by the World Health Organization (WHO) (see Figure 4.1 below), accounting for an estimated 1.6 million premature deaths annually (almost 3% of the global burden of disease) and ranked only second to poor water/sanitation/hygiene among all environmental risks for the year 2000 (WHO., 2002).



**Figure 4.1.** Global burden of disease from the top 10 risk factors plus selected other risk factors. Note: Indoor smoke category here includes only solid fuel use in households and not smoke from other fuels or tobacco (WHO, 2000; 2001).

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In developing countries, energy for cooking food, heating and other domestic activities comes primarily from the burning of coal and biomass fuel, thereby causing significant levels of indoor air pollution. There are varying degrees of evidence to suggest that the mixture of pollutants (especially, oxides of carbon, nitrogen, particulates, polycyclic hydrocarbons, as well as some toxic metals such as lead and chromium from sulphur-rich coal) emitted from these sources have the potential to cause acute respiratory infections, chronic pulmonary disease including asthma, lung cancer, nasopharyngeal and laryngeal cancers, tuberculosis as well as diseases of the eye (Ezzati, 2005). The risks are further compounded by poor ventilation in the housing units (Smith and Mehta, 2003, Zhang and Smith, 2007).

Environmental tobacco smoke (ETS); sometimes referred to as passive or involuntary smoking is another important indoor health-inhibiting pollutant (U.S. Department of Health and Human Services., 2006). Both the primary smoke exhaled by a smoker as well as the secondary smoke generated by the burning tobacco constitutes ETS. Generated by 29% of active adults smokers, ETS constitutes the largest source of indoor air pollution globally (Jha, 1999). An estimated 20%-30% increased odds of lung cancer, 25%-35% increased odds of coronary artery disease as well as potential child health risks in the form of slow lung growth, cough and wheeze, respiratory illness and sudden infant death syndrome have all been associated with living with an active smoker (U.S. Department of Health and Human Services., 2006, Dales et al., 2008). In adults, reported health risks of passive smoking include respiratory disease (USEPA, 1992), lung cancer (Hackshaw et al., 1997), ischaemic heart disease (Thun et al., 1999), nasal-sinus cancer (CalEPA, 1997). Respiratory ailments in children may range from lower respiratory tract infection, asthma and recurrent inflammation of middle ear or ottitis media (Strachan and Cook, 1997, Strachan and Cook, 1998,

Cook and Strachan, 1997). There has been a reported association between prenatal maternity smoking and sudden Infant Death Syndrome (Anderson and Cook, 1997) as well as low birth weight (Windham et al., 1999).

Off-gassing emissions are the gases that are released from indoor materials of a residential dwelling, especially those released from building materials such as wood-based products, synthetic materials, paints, floor finishes, carpets, glues, consumer products, freshly dried clothing, fried food etc (Dales et al., 2008). These emissions are highest in new host materials as well as recently applied paints, but they generally decay with time. Low ventilation may further increase the concentration of these off-gassing emissions, especially VOCs and SVOCs thereby enhancing the health risks. Off-gassing from wood-based products assembled using urea-formaldehyde resins (plywood, particle board, mediumdensity fibre board) as well as certain paints, varnishes and floor finishes and tobacco smoke are the main sources of formaldehyde in indoor environment. Concentrations greater than 1230 µg/m have been known to produce acute effects in the form of irritation of eye, nose and throat (Kulle, 1993). Some studies have reported positive associations between indoor exposure to formaldehyde and respiratory symptoms (Krzyzanowski et al., 1990, Rumchev et al., 2002). VOCs are the carbon-containing compounds present mostly in the gaseous phase. The primary sources are building materials, paints, cigarette smoke, recently dry-cleaned clothes and room deodorizers, showering products, moulds and pesticides. Oil fried foods are a source of 1,3-butadiene, acrolein, and poly aromatic hydrocarbons. The nature of health risks posed by the VOCs generally depend on its type and concentration, the age and surface area of the substrate material, depth of VOCs within the substrate material (Ott and Roberts, 1998, Meininghaus et al., 2000). Some VOCs and SVOCs are mutagenic and/or carcinogenic and sustained exposure increases risks of cancer. Increased
incidence of childhood leukemia has been reported in cases of long-term occupational exposures to VOCs as well as maternal exposures in pregnant women (Godish, 2000). Respiratory ailments in the form of asthma and bronchial hyperperactivity have also been reported (Norback et al., 1995, Wieslander et al., 1997, Institute of Medicine., 2000, Zock et al., 2007).

Higher prevalence of bronchial obstruction during the initial couple of years after birth has been associated with living in residences with polyvinyl chloride flooring and textile wall paper. Jaakkola et al. (1999) conducted an age-matched, case– controlled, 3754 birth cohort study in Oslo and concluded that bronchial obstruction was more common among children living in homes with polyvinyl chloride floor and textile wall paper than in homes with wood flooring and painted walls. In another study, plastic wall materials were associated with elevated risk of wheeze, cough and phlegm as well as asthma (Jaakkola et al., 2000). In a study conducted by Hoppin and Ulmer (2004), it was observed that increased levels of monobutyl phthalate were associated with decreased measures of pulmonary function (measured as forced vital capacity, forced expiratory volume at 1 sec and peak expiratory flow) in men, but no association was reported in the case of women.

Radon is another carcinogenic radioactive gas and an important indoor pollutant. It originates naturally from the decay of uranium in the rocks. It moves up through the soil pores, primarily driven by convection currents generated as a result of substantial diurnal/ seasonal indoor-outdoor temperature and wind pressure gradients. This causes them to accumulate in the indoor environment through the orifices and cracks in the building foundation. It has been estimated that radon concentrations on the first floor of a residence is generally less than half the level in the basement (Committee on Health Risks of Exposure to Radon., 1999). Other sources of radon are domestic ground water supplies (*e.g.* 

well water) and building materials. It has a half life of 3.8 days during which it decays producing a series of unstable solid-phase fission products, the reaction eventually terminated by the production of stable lead-210. During the radioactive decay,  $\alpha$ ,  $\beta$ ,  $\gamma$  radiations are also emitted, all of which have the potential to ionize atoms of living cells, thereby causing cell damage. Of these,  $\alpha$  radiations are most potent to the respiratory tract. Radon has been primarily identified as the cause of lung cancer, which normally develops subsequent to cumulative exposures of 5-25 years. In the US, an overall 6% of all residences and 30% of residences in Midwestern states have indoor radon levels that exceed the Environmental Protection Agency (EPA) prescribed guideline value of 4 pCi/l (Zhang and Smith, 2003). The USEPA has estimated residential radon causes about 21,000 deaths from lung cancer annually in the United States; second only as a cause of lung cancer, to smoking. Data on surveys of radon concentration in dwellings summarized by the United Nations Scientific Committee on the Effects of Atomic Radiation for over 20 European countries indicate that average concentrations vary widely between countries. It ranged from 25 Bg m<sup>-3</sup> in the Netherlands, the United Kingdom and Cyprus, to over 100 Bg m<sup>-3</sup> in Estonia, Finland, Sweden, Luxembourg, the Czech Republic, Hungary and Albania (United Nations Scientific Committee on the Effects of Atomic Radiation., 2000, Darby and Hill, 2003). One of the lowest average indoor concentrations of radon within Europe was reported in the UK (with an average annual dose of 2600µSv). Even at this low level, it constitutes one of the primary causes of lung cancer responsible for nearly 35,000 annual fatalities in a population of 59 million. Darby et al. (2001), combined the average residential radon concentration in the UK with data on UK smoking habits and data on lung cancer risks in lifelong nonsmokers and interpolated that active smoking constitutes the primary cause, accounting for 89.4% of UK lung cancer deaths. They concluded that residential radon can be held accountable for 6.5% of fatalities, approximately 2275 deaths

annually. Interestingly, they identified that of the 6.5% of lung cancer deaths attributable to radon, 5.5% are caused by radon and smoking acting jointly. The association of lung cancer with smoking and high indoor radon levels is often synergistic in nature. Radon contamination, being naturally derived, is imperceptible to our senses and so is all the more veiled in its risk potency.

Asbestos fibres were extensively employed as the primary construction material in the 20<sup>th</sup> century, especially for floors, tiles, insulation, pipes and pipe covers and their accumulation in indoor environments pose significant health risk. Continued exposure to asbestos has been identified to be a cause of lung cancer, mesothelioma and lung fibrosis (Ohar et al., 2004). Although the use of asbestos has been banned in most developed countries, it is still being mined in huge quantities, especially in Russia, and asbestos-based products continue to be exported to less developed and developing countries as an affordable housing material. In developed countries, synthetic vitreous fibres (also referred to as man-made mineral fibres, glass fibres) have popularly emerged as a replacement for asbestos. They are used in spray-applied fireproofing, ceiling tiles, thermal insulation, sound insulation, fabrics, filtration components, plasters and acoustic surface treatments (Zhang and Smith, 2003). Although the cancer risks associated with vitreous fibres are low, health risks magnify, when after considerable use, they get eroded from the parent material finding their way into the air stream of a building. Potential health risks may involve certain sick building syndrome symptoms as well as irritants to mucous membranes, respiratory tract as well as membranes of the eyes and skin (Vallarino, 2001).

Other notable pollutants found in indoor environments may include lead and inorganic gases like ozone ( $O_3$ ), hydrogen chloride (HCl), nitrous acid (NHO<sub>2</sub>), nitric acid vapour (HNO<sub>3</sub>).

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Lead poisoning is another important health hazard in the indoor environment. The main sources are the lead contaminated water lead pipes and those originating from the re-modelling/demolition of lead painted surfaces. There is evidence of association between sustained long-term exposure to lead in a domestic environment and impairment of neuro-behavioural functions (Needleman et al., 1990), and hypertension (Schwartz, 1988). Children are mostly prone to lead poisoning (Ryan et al., 1999) and a number of studies have reported the detrimental effects of lead-exposure in poorly maintained housing. Chronic neurologic damage, damage to kidneys, reproductive organs as well as inhibition of early cognitive development has all been attributed to lead (Bellinger et al., 1988, Sargent et al., 1995, Sharfstein et al., 2001).

Ozone  $(O_3)$  in indoor environments presents another health risk. It originates from its use as an oxidizing agent in purification systems and its use in photocopiers and laser printers. Exposure to high levels of  $O_3$  has the potential to cause difficulty in breathing on account of reduced lung function, aggravate asthma, irritation of eyes and nose, decrease immune resistance to colds and other infections, and hasten ageing of pulmonary tissue (Zhang and Smith, 2003). More potent are the indirect risks posed by ozone; especially in initiating a chain of reactions resulting in the generation of secondary pollutants which may act as strong airway irritants producing respiratory and cardiovascular effects (Wolkoff, 2000). Terpenes, often present in the indoor environments primarily as solvents in lemon scented detergents, pine scented paints etc can react with O<sub>3</sub> a chain of secondary pollutants, especially micro respirable to produce particulates. aldehydes. hydrogen peroxide, carboxylic acids, reactive intermediates, and free radicals including the hydroxyl radical (Zhang and Smith, 2003). The hydroxyl radical thus generated have the capacity to react with

virtually all the organic compounds of the indoor environment to produce a series of tertiary pollutants (Weschler and Shields, 1996, Weschler, 2004).

Acidic gas such as HCI may be produced in an indoor environment through thermal breakdown of polyvinyl chloride (PVC) as well as through transportation from an outdoor environment. Similarly, photochemical smog is the primary source of outdoor HNO<sub>3</sub> which may subsequently be transport t indoors. Within residences, HNO<sub>3</sub> may be formed through reactions between O<sub>3</sub>, NO<sub>2</sub> and water vapour. Again indoor HNO<sub>2</sub> may originate from a series of reactions between NO<sub>2</sub> and water films on indoor surfaces. Health-inhibiting effects of these acidic gases originate as they are irritant and corrosive to living tissues.

## 4.1.6 Factor H6: Lighting and physical health

There has been considerable evidence stressing the role of natural lighting in promoting comfort and performance (Boyce, 1981, Lowry, 1989). The direct health consequences arise especially for people undertaking demanding work requiring greater concentration and focus such as reading or sewing and lack of natural light caused problems of increased stress, headaches and a feeling of tiredness. Indirect consequences of lack of light are the risk of accidents, especially in badly lit kitchens and stairwells. The Chartered Institution of Building Services and the Illuminating Engineering Society has recommended a level of illumination of 100 lux at the bottom of a flight of stairs. Scientific studies have mostly focused on photo-epilepsy and the possibility that fluorescent lights can cause skin cancer, but no direct relationship has yet been established (Whillock et al., 1988). Not enough is known more generally about the potential physiological effects of various forms of domestic lighting. McKinlay et al. (1989) studied the impact of the ultraviolet emissions from tungsten-halogen spotlights

on bare skin. They reported the development of erythema after a few hours of exposure on the bare skin on hands.

There is a lack of clear and consistent evidence of the effect of light on mood, emotion and psychological well being. Lack of exposure to natural lighting may act as an instigating factor in seasonal affective disorder (SAD). The syndrome is characterized by the occurrence of cyclical phases of depression which usually develops during the autumn or winter months and subsequently remits in the spring or summer for at least 2 consecutive years (Partonen and Lönngvist, 1998). Furthermore, patients prone to SAD have been known to exhibit depressive symptoms including bipolar disorder. Generally, two subtypes of SAD have been encountered: winter SAD and summer SAD, of which the former is far more frequent. Exposure to shorter duration of daylight has been associated with sadness, fatigue and for some, clinical depression (Rosenthal et al., 1985). The actual etiology SAD is however unknown; but the duration of day has been identified to be the contributing factor. Indoor household environments are characterized by a light intensity of 100 lx or less, while in the workplaces it varies from 300-500 lx. The outdoor light intensity differs according to the latitude, season, time of day as well as prevalent local weather. It may range between 2000 lx or less on a rainy winter day up to 10000 lx or more in direct sunshine. Some studies have established that diurnal exposure to bright light for at least three hours during winter may offset the incidence of SAD symptoms (Rosenthal et al., 1985, Lowry, 1989). It is of interest to note that bright-light treatment in the form of exposure to visible light of at least 2500 lx is recommended as the primary option for winter SAD. The impacts of such treatment have been attributed to be mediated exclusively by the eyes, not the skin (Partonen and Lönngvist, 1998). In their study, Beauchemin and Hays (1996) reported positive role of bright light therapy in recuperation of patients suffering from severe

depression. The average recovery period was significantly less in patients of sunny rooms as compared to dimly lit rooms.

## 4.1.7 Factor H7: Noise and physical health

Involuntary exposure to ambient noise may directly result in impairment of the ear organ and noise induced hearing loss (NIHL). In addition, indirect non-auditory or extra-aural effects are often reflected in the form of various types of psychosocial and physiologic symptoms and related problems. The psychosocial impact of earsafe sound levels may manifest itself in the form of annoyance, reduced performance quality, and increased levels of aggressive behavior (Passchier-Vermeer and Passchier, 2000, Stansfeld et al., 2000, Stansfeld and Matheson, 2003). Exposure to both traffic and aircraft noise have been reported to be associated with higher odds of annoyance in dose-response relationships. It has been said that noise-induced annoyance, in most cases originate as a result of intrusion in day-to-day activities (Taylor, 1984). Another impact of noise is the disturbance caused to the restorative functions of sleep and relaxation. In presence of ambient noise, external stimuli are generated that continue to be processed by the sleeper's sensory functions and such non-conscious perception causes sleep deprivation (Muzet, 2007). Excessive community noise in overcrowded residences as well as from neighbouring residences and traffic has the potential to cause sleep deprivation resulting in impaired concentration and irritability (BMA., 2003). Another study has corroborated the association between microarousal and/or insomnia and elevated levels of metabolic rate which may further cause health impairments (Raschke, 2004). Indirectly, sleep deprivation has been associated with an enhanced risk of injury and accident. Exposure to ambient noise also disturbs communication and speech intelligibility, and they interfere with mental tasks that require concentration. Chronic noise has been

associated with elevated cardiovascular functioning among children (Cohen et al., 1986). In another study, Babisch (2000) has highlighted the potential associations between noise induced stress and elevated levels of blood pressure and cardiovascular risks. Several studies have suggested that cumulative occupational exposure to persistent noise at levels in excess of 85 dB have the propensity to increase blood pressure (Zhao et al., 1991, Lang et al., 1992).

Research results have highlighted somewhat confounding relationships between noise sensitivity and psychological disorders (Stansfeld et al., 2000). Traffic noise has been associated with higher prevalence of depression (Song et al., 2007). In a cross sectional study conducted by Stansfeld et al. (1996) looking at 1725 adults of Caerphilly, aged 50-64, the authors concluded that traffic noise was not an independent cause of overall psychiatric disorder subsequent to controlling for socio-demographic factors and baseline psychiatric disorder of the respondents. Nevertheless, noise has been shown in other studies to be related to anxiety and depression. In children, noise has considerable negative cognitive performance effects on reading, attention, and long-term and working memory. Chronic exposure to noise and to crowding has been associated with increased vulnerability to negative motivational effects, also called 'learned helplessness'. This refers to a syndrome in which individuals exposed to undesirable and uncontrollable stimulus (noise pollution in this case) learn to adapt themselves to the fact that their efforts to control or escape from it are futile (Seligman, 1975, Rodin, 1977, Cohen et al., 1986). Evans et al. (1995) concluded from their studies that psychophysiological stress originating from chronic exposure to aircraft noise were related with coronary heart disease: cognitive functioning, including speech perception, memory and basic reading skills; motivation; and emotional affects among children. They reported higher than normal baseline levels of adrenomedullary neuroendocrine as well as marginally elevated levels

of systolic blood pressure in children chronically exposed to community noise. Differential cardiovascular reactivity in response to task demands was observed among noise exposed children, indicating chronic environmental stress. Among the cognitive processes affected, they reported slight reductions in working memory, poorer long term recall ability, reading deficits, poorer motivation levels, and higher annoyance levels. Evans et al. (1995) further observed that in reference to children from quieter environments, those chronically exposed to noise exhibited reduced sensitivity to distracting and background noise during a speech perception task. In another study, Lercher et al. (2002) considered the relationships between ambient noise levels and multiple mental health indices among 1280 elementary school children after controlling for individual level confounders of age, sex, education, house type and household density. They reported a linear dose-response function. Early biological risks, especially low birth weight and pre-term delivery, aggravated the psychological impacts of noise exposure. More specifically, exposure to community noise was associated with psychological symptoms and quality of life primarily in those children with a preexisting biological risk (such as low birth weight). Exposure to aircraft and road traffic noise at home and schools has also been found to have negative implications on the health and cognitive development of children. Exposure to aircraft noise has been associated with the impairment of childrens' cognition, negatively impacting tasks involving central processing and language comprehension, such as reading, giving attention, problem solving, reading comprehension, long-term memory and motivation (Evans and Maxwell, 1997, Haines et al., 2001a, Haines et al., 2001b, Hygge et al., 2002, Stansfeld et al., 2005). In their study of 2844 school children aged 9-10 years in the Netherlands, Spain and UK, Stansfeld et al. (2005) found linear associations between exposure to chronic aircraft noise and impairment of reading comprehension and recognition memory. On the contrary, a non-linear

association was established between aircraft noise exposure and annoyance both in their uncontrolled models and subsequent to adjustments for mother's education, socioeconomic status, longstanding illness and extent of classroom insulation against noise. Exposure to road traffic noise was linearly associated with levels of annoyance and impairment of quality of life. Interestingly they also observed that exposure to road traffic noise was associated with improved episodic memory scores, in terms of conceptual recall and information recall.

# 4.2 Factorising the housing-level determinants of mental health

The housing environment may be viewed as the private, psychosocial space that facilitates and constrains the desired activities of its occupants. Good quality housing tends to minimize stress and aid the accomplishment of sound health. Furthermore, each individual dwelling unit helps construct the form and structure of its larger neighbourhood and it is wrong, therefore, to view issues of housing quality to be disjointed from the overall neighbourhood context of which they form a part. The physical and socio-economic characteristics of the surrounding neighbourhood play a significant and consistent role in defining the health of residents. For example, at the community level, one of the factors that often results in health inequity is the disparity in the distribution of good standard housing. Sub-standard, overcrowded homes are generally associated with neighbourhoods characterized by low socio-economic status and other indicators of urban decay (Wandersman and Nation, 1998).

#### 4.2.1 Factor H8: Housing type, floor level and mental health

Several studies have suggested that multi-unit dwellings and multi-storied housing has adverse implications on the mental health of inhabitants. The

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hypothesis is typically framed in terms of social withdrawal and confinement: the levels of communication between families living in such dwellings are much reduced compared to those living in landed houses resulting in isolation and loneliness. In enclosed multi-storied residential environments, the physical proximity to other living units, doorway orientation to common access ways and interaction nodes as well as the presence of porches, balconies, terraces, and patios govern the level of visual exposure and access to neighbours and all may have implications on mental health. Lack of the lobbies, lounges and other communal gathering spaces result in reduced residential control, lack of a sense of ownership/ territoriality and difficulty in developing and maintaining social networks (Festinger, 1963).

In a pioneering study, Fanning (1967) performed a comparative assessment of the health status of families of members of the armed services personnel stationed in Germany and living in flats with those residing in houses. In a sample of 558 families, he reported that 57% higher morbidity occurred in the inhabitants of the flats than that of the houses, especially with respect to the the incidence of respiratory infections in young women and children, and that of psychoneurotic disorders in women. Psychological strain among apartment dwellers varied directly with the floor level on which their dwelling units were located. The odds of incidence of psychoneuroses in women living in the top (third) floor were reported to be twice in reference to those who lived on the ground floor. Furthermore, there was a steady increase in incidence as the height of the residence increased. Mitchell (1971) also highlighted the higher degree of segregation and corresponding emotional strain in residents of multi-family buildings living in upper floor levels of high density housing in Hong Kong. He observed a positive association between floor level and emotional illness & hostility, but only for residents living with non-related people in one dwelling. Gillis (1977) investigated

the relationship between the various facets of high density design (shared walls, shared floors, shared ceilings, floor level of dwelling unit), internal density (persons per room), and external density (persons per acre), and psychological strain, with sex as an interacting variable in 442 resident of the Canadian cities of Edmonton and Calgary. They observed a positive correlation between floor level and psychological strain among women and an inverse relationship in men. Also, a negative relationship between shared floor and strain among women existed pointing to the insecurity experienced by women living on the ground floor. Hannay (1981) tried to measure the mental symptoms among 964 adult Scots living in mixed dwelling types. He observed that the residents of the fifth floor of high rise dwellings exhibited twice the number of mental symptoms as compared to those living in lower floors of high rise buildings or other housing types. Edwards et al. (1982) studied marital relationships and psychiatric problems among 560 family members with dependent children, living in single family detached and multi-family housing. They reported more psychiatric and parental problems among men living in multi-family housing whereas the difference was minimal in the case of women. Both men and women living in multi-family housing had more marital problems in the form of arguments, threats to leave etc. In another study conducted upon 674 English adults living in diverse housing, McCarthy et al. (1985) reported higher levels of psychological distress among residents of high rise housing within neighbourhoods of low socio-economic status. In the well-off neighbourhoods, the effect of housing type was nonsignificant. In a study conducted upon 600 African American elderly residents living in high rise buildings and detached homes, Husaini et al. (1991) observed higher rates of depression and psychiatric disorders and social isolation among the high rise dwelling elderly people.

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Enhanced rates of behavioural ailments in children living in high-rise and multiple dwelling complexes in comparison to those residing in single-family homes or smaller, low-rise buildings have been highlighted in many studies (Ineichen and Hooper, 1974, Richman, 1977, Saegert, 1982a, Oda et al., 1989). Rates of juvenile delinquency are also higher among adolescents in multiple dwelling units relative to those in single-family detached homes (Gillis, 1974). The absence of play spaces, gardens and greenery is thought to be a contributing factor. Re-districted outdoor play behaviour has been associated with pre-school distress (Bartlett, 1998). Parental practices in enclosed high rise residential environments tend to be more rigid and restrictive and these, it is believed, manifest themselves in the form of impaired or undeveloped emotional and social adaptation and associated behavioural problems (Stewart, 1970).

Generally, multi-family dwellings tend to be more proximate to busy streets and have exposure to higher levels of traffic volume and pollution and residents tend to be more socially withdrawn with a lesser likelihood of knowing their neighbours (Appleyard and Lintell, 1972, Mueller et al., 1990). Housing tenure or the occupancy status is another important factor that has been found to influence the health of residents. A dwelling may either be occupied by the owner or rented (Howden-Chapmam, 2004). In case of owner occupied homes, they may be owned outright, share-owned or owned with a mortgage. Rented dwellings may be rented from the local council, housing association, registered social landlord, outright from a private landlord or through a letting agent. Generally, home owners, outright or without mortgage tend to report a greater sense of satisfaction, security and control and consequently better health status than those who rent their house. A few British studies have highlighted such variations in health status between owners and tenants (Ellaway and Macintyre, 1998, Macintyre et al., 2001, Macintyre et al., 1998). They observed that in addition to

being a marker of income which is a direct predictor of health, housing tenure may have an effect on health on account of its association with housing stressors and types of area, which may themselves be directly health damaging.

#### 4.2.2 Factor H9: Housing quality and mental health

The overall quality of housing, often parameterized by the existence of structural deficiencies, presence of cold, damp and mouldy interiors, pest infestation, level of indoor air quality and noise, level of housing dissatisfaction etc has a considerable influence on psychological processes and thereby affect mental health. Most of the cross sectional studies indicate that poor housing quality is associated with elevated levels of psychological stress among residents. This may be attributed to the negative perception of stigma and neglect associated with people living in poorly maintained houses of impoverished neighbourhoods. They feel disjointed from the larger community, resulting poor social capital and support, enhanced stress and dissatisfaction, poor self esteem and self efficacy, negative affects and a general lack of well being (Halpern, 1995). Another source of anxiety and worry originates from insecurity related to structural hazards and lack of proper hygiene in poor quality housing. Furthermore, physical hazards posed to elderly residents owing to step design, flooring material, lighting etc may have an aggravating effect on their physical and mental health (Van Rossum et al., 1993).

Hyndman (1990) reported significant associations between damp, mouldy, and cold indoor environment and elevated levels of anxiety and depression. Gabe et al. (1993) reported a J-shaped relationship between household density and psychological distress in women. Furthermore, the women were more prone to the detrimental effects of overcrowding as compared to men, often manifested on account of sleep deprivation, dissatisfaction with housing repairs and cleanliness

and stress of unwanted re-housing. Platt et al. (1990), in their study, which controlled for social class, employment status and household income, reported significant levels of association between damp housing conditions and women's scoring on a general health questionnaire (GHQ). In another study conducted by Packer et al. (1994), damp housing conditions were found to be associated with a significantly greater likelihood of reported problems related to lack of energy, sleep, and social isolation after adjusting for age, sex, and social class. A study conducted on 451 Glasgow residents, aged 17-65 demonstrated that household dampness resulted in higher odd of mental health disorders among its residents subsequent to statistical adjustment for socio-economic status. A potential cause of social isolation of residents of substandard housing may be the occupants' reluctance to invite guests into their homes (Hopton and Hunt, 1996). On the contrary, Collins (1993) reported a linkage between excessive indoor temperature and higher degrees of irritability and social intolerance. In another study conducted by Weich and Lewis (1998), data on 9064 UK adults aged 16-75 years from the British Household Panel Survey reported that common mental disorders measured by the 12-item General Health Questionnaire (GHQ) were significantly associated with poor material standard of living. One of the standard of living indicators of the study included the presence and number of structural housing problems, namely damp, condensation, leaking roof, and/or rot in wood. Zahner et al. (1985) had performed a longitudinal study on 337 Black and Latino US women controlling for income and reported that rat infestation was consistently associated with increased psychological symptoms.

Other studies have focused on the relationships between overall housing quality indices and the state of mental health of residents. Obasanjo (1999) studied housing quality of 680 urban African American adolescents aged 13-19 years based on eight self reported parameters of housing maintenance. After

statistically controlling for SES, race, age, and gender, housing quality was a significant predictor of social support, directed attention fatigue and psychosomatic illness. Evans et al. (2000a) employed trained raters to evaluate the quality of residence and its immediate environment and developed a three point rating scale using psychometric scaling procedures comprising six subscales: structural quality, privacy, indoor climatic condition, hazards, cleanliness/ clutter and neighbourhood quality. They evaluated psychological distress with the Demoralization index of the Psychiatric Epidemiological Research Instrument (PERI). Their cross sectional study of low and middle income, white, rural mothers reported that good housing quality was an independently associated with lower odds of psychological distress subsequent to adjustments for income. Another longitudinal study assessed the levels of psychological distress before and after moving to better quality housing. The pre- and post-move psychological distress among low income African American and White women residing in urban area was measured using PERI scores. The study reported a significant relationship between changes in housing quality and residualized psychological distress. In another study, Galea et al. (2005a) examined the impact of internal and external quality of housing and adjoining built environment upon depression in fifty nine neighbourhoods of New York City. They observed that the resident of neighbourhoods distinguished by poorer physical built environment features were associated with 29%-58% greater odds of reporting depression in the preceding six month and 36%-64% greater odds of reporting lifetime depression in reference to residents of better quality neighbourhoods.

Insecurity from crime contributes to psychological stress and there exists a complimentary relationship between poorly maintained dwellings, crime and mental health. It is generally considered that when a building has more than 50 apartments, residents tend to treat one another as strangers, making them more

vulnerable to crime (Cohen et al., 2003). Territoriality is a characteristic of the physical environment and pertains to the ability to supervise and control use of neighbouring space. Generally, extensive building structures, long interior hallways and lobbies, lack of group spaces, and poor visual surveillance capability (e.g., inability to monitor entrances and places of concealment) have all been associated with reduced supervision, surveillance and sense of ownership (Newman, 1972, Taylor, 1988, Sampson et al., 1997). Houses located in areas with high traffic speed limits and characterized by fewer fences, barriers, insecure entryways, poor lighting, and fewer signs of being occupied or with low visual access to neighbours (reducing territorial control) are more likely to be burgled (Newman, 1972, Rand, 1984, Taylor and Harrell, 1996). The presence of vacant or boarded-up housing in a neighbourhood generates increased fear of crime amongst the residents and outsiders and is associated with reduced accessibility to business, markets, community services, thereby contributing to social exclusion and poorer health outcomes (Sampson et al., 1997). Chandola (2001) employed the 1996 British Crime Survey data and reported that the fear of crime was independently associated with poorer self-rated health subsequent to statistical controls for individual and household level socio-economic factors as well as individual health behaviour. In another study, Cohen et al (2003) highlighted the positive association between the number of boarded-up dwellings and rates of gonorrhea as well as mortality due to neoplasms, diabetes, homicide and suicide. Some studies have tried to focus on the potential relationships between subsidized public sector housing; often called council housing or affordable housing for the low income groups and health; however, no conclusive evidence has been demonstrated. In another large scale study of 10,000 Londonbased civil servants, Stafford et al. (2007a) found that the respondents reporting greater fear had 1.93 times higher odds of depression, reported lower mental health scores and were less likely to be physically active.

Several studies have highlighted positive effects of relocating from low income neighbourhoods in terms of improvements in mental health of both adults and children (Elton and Packer, 1986, Delgard and Tambs, 1997, Johnson et al., 2002). On the contrary, low income residents of substandard housing have to deal with the hassles of maintenance and are often subjected to higher rates of involuntary relocations (Evans and Kantrowitz, 2002). Involuntary or uncontrolled housing relocations have been known to produce negative impacts on the psychological health of older adults (Lawton, 1980), in addition to causing socio-emotional stress in children (Adam and Chase-Lansdale, 2002).

### 4.2.3 Factor H10: Overcrowding and mental health

Household overcrowding is synonymous with high density living and congestion of land, livable space and facilities. Loss of control over interpersonal relationships and increasing unwanted social interactions has been identified as causes of adverse effects on psychological well being (McCarthy and Saegert, 1979, Saegert, 1982b). Enforced involuntary interactions and loss of privacy result in higher instances of intrusion or unwanted inputs from other residents. This causes potential interferences in individual's activities. Another potential negative impact of crowding is the impairment of development and maintenance of socially supportive relationships and subsequent social withdrawal (Evans and Lepore, 1993). Research has increasingly highlighted the association between higher levels of interior residential density (people per room) and elevated levels of psychological distress among adults (Marsella et al., 1970, Hassen, 1977, Gove and Hughes, 1983, Gabe and Williams, 1987, Jain, 1987, Evans et al., 1989, Lepore et al., 1991). Gove et al. (1979) reported that domestic overcrowding was negatively associated with psychological health subsequent to adjustments for socio-demographics and social class. They observed that the

subjective perception of crowding was more potent to psychological health than objective crowding. Duckitt (1983) studied the nature of relationships between household crowding and psychological well being among 433 coloured South African residents. After controlling for potentially confounding demographic and socio-economic variables, he reported that crowding showed a statistically significant association with negative psychological effects. The nature of variation of the negative effects was non-linear; an initial spike followed by a flattening phase. He explained that crowding introduces psychological discomfort which creates motivational pressures on individuals resulting in reduction or reorientation of the time spent at home. In a comparative study of differential effects of household crowding across gender, Gove and Hughes (1979) reported that married women had greater reactivity to crowding than their male counterparts. Fuller et al. (1996) studied the nature of relationship between crowding and five indices of psychological well being (measured in terms of psychological distress, unhappiness, irritability, 'lose your mind', 'contemplate suicide') among 2017 random households in Bangkok. Crowding was operationalized in terms of both objective and subjective components. Objective crowding was measured with the help of three indicators namely, persons per room, persons per hundred square metre area in the dwelling unit and others per room. Subjective crowding was associated with the experience of crowding originating from inability to achieve desired levels of privacy, and was measured using a "lack of privacy" scale. Subsequent to statistical adjustments for sex of respondents, socioeconomic status, household structure, stage in the family life cycle and household control, they reported that objective crowding was mediated by subjective crowding, and was non-beneficially associated with well-being. The study could not identify any gender differences. Furthermore, the effects of both objective and subjective crowding were identical in both two- and threegeneration households, as well as in one- and multiple-couple households.

Zlunick and Altman (1972) made a distinction between residential crowding and community or urban crowding with the former referring to the interior density or the number of people per house or room, and the later, to exterior density or number of people or houses in the neighborhood. The nature of configuration of the two types of density in an urban setting governs the degree of interpersonal contacts and the stimulation produced in a person both inside and outside the residence. Stokols (1976, 1978) identifies a two level hierarchy of social environments; primary and secondary environments. The primary environments (especially, our home and offices) are where the personal interferences originates as a result of the individual staying in them over long periods of time, maintaining close social relations, and behaving appropriately in a manner well recognized by the fellow members. The secondary environments are more of a source of neutral interferences as a result of encounters which are often transient, casual, intermittent, having minimal effects on the relationships established. Crowding caused by personal interferences in primary environments has stronger and more persistent impacts upon mental health as compared to crowding produced by neutral interferences in secondary environments.

Wachs and Gruen (1982) highlighted the delayed cognitive development evidenced in pre-school children dwelling in overcrowded homes. Evans et al. (2002b) have studied the potential role of built environment design in exacerbating or improving the deleterious impacts of overcrowding upon the mental health of children. They observed positive correlations between residential density (people per room), housing type (single-family, row house, multiple dwelling unit) and a standardized self-report index of psychological health (KINDL) as well as teacher ratings of behavioral conduct among 1236 third and fourth grade Austrian children. They concluded that the relations between residential density and psychological well being are moderated by housing type.

Children residing in multiple-family residences exhibited greater reactivity to highdensity environments than those living in either single-family or row houses.

A better designed inner residential environment has the potential to foster better regulation of interpersonal contact. Baum and Valins (1979) conducted a series of studies showing that long corridor dormitory designs caused elevated crowding and greater problems with respect to the regulation of social interaction in comparison with either suites or short corridor designs. In a follow-up study, negative effects of crowding were further exacerbated in a redesigned environment, wherein long corridor dormitories were remodeled in order to reduce the number of residents sharing a common corridor (Baum and Davis, 1980). Evans et al. (1996) employed space syntax analysis to measure the degree of integration of residential floor plan configuration among off-campus student housing units. Floor plans with greater depth indicated higher level of separation and lower integration, thereby acting as buffers to the crowdingdistress relationship. The existence of an array of niches for social contact such intimate private spaces, group spaces for close-knit small network as interactions, community spaces such as parks, community centres for large-scale interactions have been associated with greater perceived control and comfort in residential settings. The size, location, and permeability of interior rooms govern the level of social control afforded and hence the interactions among residents (Zimring, 1983, Evans et al., 1996).

Gomez-Jacinto and Hombrados-Mendieta (2002) conducted two cross-sectional studies on 191 and 259 residents of Malaga, Spain to identify the multiple effects of interaction between community and household crowding, reporting similar results. A strong interaction between both kinds of density was thought to intensify the negative effects of both stressors on residential satisfaction. On employing an interactive model for both densities, high community density was reported to have strong negative effects on psychological stress only when household density was also high. In other words, community density effects are cancelled out by an optimal density within the household. Furthermore, in low density communities, increments in household density resulted in a slight reduction in psychological stress; stressing the role played by increased levels of social support in high density households.

On the contrary, research has pointed to the fact that high density neighbourhoods are generally associated with more walking. Ross and Dunning (1997) analysed the results of the National Personal Transportation Survey, 1995 and observed that in the densest neighbourhoods with over 3000 dwelling units per square mile, 14.9% of the trips were made on foot or bicycle, while in the least dense areas with fewer than 100 dwelling units per square mile, trips made on foot or bicycle formed only 3.3%, indicating an almost five-fold reduction. Thus, planning at the neighbourhood level should envisage an appropriate mix of the different categories of housing, in terms of housing type, affordability and tenure. The availability of diverse housing options arms the households with an opportunity to find a dwelling consonant with their income and needs, thereby reducing housing stress and consequent ill health. The policy of housing diversity tends to facilitate a diverse social mix, thereby inhibiting social exclusion and promotes a sense of community, which can have positive health effects.

# 4.3 Neighbourhood-level determinants of health

In the United Kingdom, the publication of the Black Report in 1980 by the Working Group on Health Inequalities was a significant landmark reorienting interest towards neighbourhood level determinants of health. It initiated developments in the empirical measurement of socio-economic status, health inequalities, premature deaths as well as longitudinal designs and linkages with

census level data (Department of Health and Social Security., 1980, Macintyre, 1997). With the increasing consensus among epidemiologists that risk factors operate at population levels and that there is a need to assess cumulative population level socio-economic factors, the importance of contextual factors gained predominance (Rose, 1985, Susser, 1994a, Susser, 1994b, McMichael, 1999). It has been hypothesized that in addition to individual pre-dispositions, the specific socio-economic, cultural, physical and built environment attributes of a place influences our health related behaviours and exposure to risk factors, and thereby configures the health outcomes and mortality. The case for due consideration to place effects was seminally articulated by Townsend et al. (1992) by stressing the importance of local neighbourhood. Based on the UK Health and Lifestyle data, Blaxter (1990) highlighted the role of external living environment in the significant geographical variations in lifestyle. Macintyre et al. (1993) have directly queries whether the origins of area-level differences in health outcomes are compositional or contextual in nature.

Most of the initial research tended to concentrated on large scale ecological studies involving aggregated area-level measures of exposures to specific socioeconomic variables such as income, educational attainment, occupational levels, indices of deprivation while, health has been expressed in terms of aggregated mortality and morbidity. Lack of data at individual level meant that aggregate measures merely acted as surrogates for individual level data. Through the aggregation effects of selection, distribution, interaction, adaptation etc, ecological models were generally considered to be successful in capturing contextual effects that could not be analyzed at an individual-level analysis. Proponents of these studies highlighted their effectiveness in identifying population patterns and studying emerging public health impact of policies, as illustrated by this 1992 quote:

"Although ecological studies are clearly inferior when the purpose of research is to isolate "independent" risk factor-disease associations, they are essential for addressing population characteristics such as epidemic cycles or economic relations. The ecological design is chosen here not as a substitute for a "superior" individual study, but as a tool for investigating population-level determinants of disease that cannot be addressed with individual-level study designs" (Wing et al. (1992) p. 204).

Most studies employed data aggregated at the levels of census defined regional and local geographies. The OPCS longitudinal survey of England and Wales followed up 1% population of the 1971 census so as to link them to subsequent censuses and vital statistics. Significant variations in mortality were observed across the 36 types of places (Fox and Goldblatt, 1982, Fox et al., 1984). Another study employed the same survey data to classify local authority districts into 30 socio-residential clusters based on housing tenure and social class and reported significant differences in mortality between the areas/ clusters (Britton et al., 1990). Eames et al. (1993) conducted an ecological study of the association between premature mortality and social deprivation, operationalized in terms of a Carstairs index, Townsend index, and an underprivileged area score across 14 regional health authorities covering 8464 electoral wards of England. Higher mortality from all-causes, coronary heart disease, and smoking related diseases were found to be significantly associated with increasing area-level deprivation scores. Another decadal English study noted significant differences in life expectancies across 105 district health authorities (DHAs) in relation to the Jarman deprivation scores of the DHAs, with deprived areas manifesting lesser longevity and higher gender differentiation (Raleigh and Kiri, 1997). A comparable study identified area-level educational attainment and deprivation as significant predictors of all cause, coronary and infant mortality in 107 local

educational authorities of England (Morris et al., 1996). Shouls et al. (1996) developed an area typology based on clustering of a set of variables pertaining to life-stage, ethnic composition and socio-economic status for 278 Sample of Anonymized Records (SAR) districts of England from the 1991 census, and studied the association with mortality and morbidity. Limiting long term illness and premature mortality was found to be significantly associated with area-level socio-economic conditions and urban-rural divide. The study also highlighted the prevalent north-south divide in health. Results along similar lines were reported in many of the simultaneous large scale US studies. In one of the earliest studies employing census tract data for Houston, Briggs and Leonard (1977) observed that the mortality differentials were significantly associated with socio-economic disadvantage. Wing et al. (1987) studied the relationship between the populationweighted age-adjusted rates of ischemic heart disease (IHD) and occupational structure across 3102 counties of US. A lower IHD mortality was associated with communities having higher fractions of white-collar employment for both men and women. A subsequent study conducted exclusively for white women in the US identified the structural economic parameters of the state economic areas (SEAs), especially average income, educational attainment and occupational levels, determined the shape of the CHD epidemic curve (Wing et al., 1992). In another study, Louge & Jarjoura (1990) found that the risks of age- and sexadjusted census tract specific heart disease (HD) mortality among the lower middle class and the working poor category were respectively 1.9 and 4.5 times the rate observed in the referent upper middle and middle class category.

Much of these well-intentioned epidemiological studies, however, are deemed less meaningful on the grounds of a long standing critique (Thorndike, 1939, Robinson, 2011) that the relationships observed at the aggregate level cannot provide an accurate manifestation of individual level relationships. Selvin, (1958)

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coined the term *ecological fallacy* to illustrate the bias associated with attempts to extrapolate data from area-level analysis to make inferences at an individual level (a fundamental inferential fallacy). More precisely, there exists a bi-directional inferential fallacy (Alker, 1969, Susser, 1994a, Diez-Roux, 1998, Pearce, 2000). In individual risk factor analysis, the failure to statistically control for the effects of population context leads to the *atomistic/individualistic* fallacy, wherein a predominantly individualistic approach overlooks the contextual aggregation effects and may also be prone to specification bias. On the other hand, the large scale ecological studies are prone to bias from aggregation effects as well as specification errors.

Sociologists point out that social processes are operationalized at population levels and are manifested over spatial aggregates within which the social groups function; and these aggregate effects configure an individual's exposure and vulnerability to risks. Hence, the aggregated area-level factors pertaining to variables relating to demographics, lifestyle, socio-economics and deprivation reflect how the cumulative health defining characteristics of individuals such as education, employment, income, deprivation, SES, social capital, etc are distributed in a specific place and over a specific population. It has been highlighted that these contextual macro-level factors have an independent affect upon an individual's health outcome (Blalock and Wilken, 1979). It is also noteworthy to mention that almost simultaneously over the same period; there has been a substantial development in statistical techniques that has led to the proliferation of models and software that have the capability to handle hierarchical data structures (Duncan et al., 1998, Diez Roux, 2001). All these developments have led to the evolution of a new epidemiological approach aimed at minimizing the bi-directional inferential fallacies wherein in addition to the micro level compositional (individual) variables, a set of macro-level group or area

variables are used to simultaneously capture the myriad social processes considered important in the causation of disease. Such modelling approaches that incorporate area-level ecological measures of socio-economic context in to the individual-level risk equations are termed as multi-level or contextual analysis (Von Korff et al., 1992, Diez-Roux, 1998). Two categories of group-level variables are typically included in such models: the derived variables which are aggregated analogues of individual level variables within the group/area; and the integral variables which pertain to the intrinsic characteristics of the group or area as a whole. Such models, which are typically implemented using regression that partitions variance explained and errors into individual and aggregate (or spatial) factors, deal with the ecological fallacy problem at the same time as overcoming the lack of contextualization in earlier individual-based models.

In recent years an increasing number of studies have reported a variety of area aggregated measures of poverty and socio-economic deprivation to be significantly associated with health outcomes after adjustments for individual level variables (Pickett and Pearl, 2001). In a nine year prospective study of the impact of socio-physical environment in Almeida county, Haan et al. (1987) observed significantly higher rates of mortality among the residents of poverty areas as compared to non-poverty areas; the differences persisting even after subsequent statistical adjustments for individual level socio-demographic, lifestyle and health factors (age, sex, race, baseline physical health status, low income, lack of medical care, smoking, unemployment, education, health practices, social isolation and psychological uncertainty). Diehr et al. (1993) reported significant areal variations in the four lifestyle behaviours of smoking, consumption of alcohol, dietary fat and the use of seatbelts independent of individual characteristics; the magnitude of area effects was reported to be less than 1%. Waitzman and Smith, (1998) conducted another national level study employing

the data from National Health and Nutrition Examination Survey (NHANES I) and observed significantly higher risks of all cause, cardiovascular and cancer mortality among those aged 25-54 years subsequent to adjustments for a number of individual and household characteristics. In another study in four US communities, Diez-Roux et al. (1997) concluded that neighbourhood context shaped the population distribution of coronary heart disease such that living in deprived neighbourhoods was associated with increased odds of coronary heart disease and exposures to risk factors, with the associations persisting after adjustments for individual-level variables. From their studies conducted in the towns of Reinfew and Paisley in west Scotland, Davey Smith et al. (1998) observed that both individual social class and area-level deprivation were independently and inversely associated with all cause and cardio-vascular disease mortality. They advocated that socio-economic measures in epidemiological studies should be operationalized at both the individual and neighbourhood levels to overcome any residual confounding. Along similar lines, Lynch et al. (2000) espoused the necessity to employ measures of income distribution as well as individual income to identify the multi-level health differentials across individuals and aggregated spatial units. Another multi-level Swedish study identified higher hazards of coronary heart disease among individuals living in neighbourhoods associated with lower area-level income and education independent of individual level variables (Sundquist et al., 2004).

Some studies though have reported negligible contextual effects. In a 9 year follow-up study of 300,000 respondents of Office of Population Censuses and Surveys, Sloggett and Joshi (1994) found that all cause mortality was significantly associated with ward level deprivation for both men and women. However, adjustments for the regional zone and wide range of individual socio-economic circumstances (economic activity, social class, presence of spouse, car access

and housing tenure) progressively minimized and explained away the effect of ward deprivation in men, while it was strongly attenuated in case of women. The study thus could find no evidence of social miasma whereby proximity to deprived areas was independently associated with higher rates of mortality. Another subsequent study conducted by the same team similarly found no evidence of area-level deprivation upon adverse fertility events in women (Sloggett and Joshi, 1998). Another comparative study of mortality differences between West Scotland and South England identified as significant, difference in the distribution of deprivation among individuals rather than differences between places *per se* (Davey Smith et al., 1995).

A number of multi-level studies have attempted to evaluate the magnitude of place effects by partitioning the variances into between individual (within-area) and between area effects in addition to adjustments for individual and area level variables. Stressing the significance of within-area correlation in a social epidemiologic context, Merlo (2003) points out that a higher correlation is synonymous with a greater homogeneity in the health outcomes of individuals within a neighbourhood, which, in-turn reflects the potential effects of neighbourhood context upon the determinants of individual health. Humphreys and Carr-Hill (1991) employed data from the Health and Lifestyle survey data to construct a series of two-level models with significant ward level variability in health outcomes after controlling for individual socioeconomic characteristics and health-related behaviour. Jones & Duncan (1995) employed a similar study design on a larger sample size, also allowing for complex interactions and reported similar findings. Duncan et al. (1993) constructed a three level model upon the Health and Lifestyle survey data to study the geographical variations in lifestyle behaviour with respect to smoking and alcohol consumption across the UK. They reported a predominant individual level effect with negligible place

effects across wards and regions. A similar subsequent study observed no significant variations in psychiatric morbidity at the ward and regional levels of UK. Furthermore, the study demonstrated that compositional attributes were a predominant determinant of mental health with no neighbourhood effects (Duncan et al., 1995).

Several conceptual and methodological challenges still remain to be overcome in multi-level epidemiological studies. Several authors have highlighted the issues with respect to causal inference and the lack of theory on the mechanisms as to how neighbourhood level factors configure the risks and thereby health outcomes (O'Campo, 2003, Oakes, 2004). The second point pertains to the choice of optimized definition of areal units or neighbourhoods with respect to size and degree of heterogeneity so that it can accurately capture the population level socio-economic, political, cultural, environmental and institutional processes within it (Diez Roux, 2001, O'Campo, 2003). It may be noted that this is all the more difficult without well-formed theory about the causal process resulting in the alleged area or aggregate effects. Thirdly, these models are sensitive to the choice of individual and area-level variables and hence due care should be given so as to avoid misspecification of models at the more important individual level and to avoid psychologistic and sociologist fallacies (Riley, 1963, Diez Roux, 2001).

Since the early 2000, in addition to neighbourhood level socio-demographic and deprivation variables, urban planners, epidemiologists and public health scientists have conducted extensive research into the role of the neighbourhood built environment. These have attempted to unravel Macintyre's *black box* of *contextual determinants of health*. The independent association of both objective and subjective built environment factors (as neighbourhood level factors) with

individual health outcomes after adjustments for individual level covariates has become an important field of research.

The subsequent sections of this thesis continue in this tradition by asking the basic question: Is there a *miasma* of urban built environment factors that influence health and behaviour? The thesis both reviews the research evidence in the field and goes on to add new evidence using a new method of capturing more accurate objective built environment contextual data.

I conclude this discussion by quoting Sally Macintyre's following remark, which highlights the importance of studying the contextual determinants of health:

"Context" is thus often treated as a residual category, containing those factors influencing human health behaviours or health which remains once every imaginable individual characteristics is taken into account. It is indeed a black box, an unspecified "miasma" which somehow, but we don't know how, influences some aspect of health, health related behaviour or health risks in some population groups (Macintyre et al. (2002) p. 129)

#### Factorising neighbourhood-level determinants of health

There has been a growing consensus amongst epidemiologists that built environmental factors; especially those influencing healthy eating, physical activity behaviour and social interactions are independent predictors of health outcomes. The defensive role of physical activity in offsetting a number of chronic diseases, both independently as well as via its inhibitory effects on weight gain and obesity has been long acknowledged. Similarly, in the health promoting/inhibiting influences of neighbourhood built environment upon mental health outcomes is well established. The projected worldwide increase in the older adult population further exacerbates the problem. With reduced physical capacity, the aged tend to more vulnerable to the inhibiting influences of their immediate activity space, tending to lead a more sedentary life style and thereby be prone to health risks.

Given the positive health implications of physical activity, recent decades have witnessed considerable community based initiative to achieve appropriate levels of physical activity. A strong research agenda has emerged that poses the question: *What attributes of the neighbourhood built environment promote physical activity and health*? Neighbourhood streets have been recognized as the most obvious sites for engaging in physically active behaviour and this has led to the emergence of the popular concept of *neighbourhood walkability*.

Neighbourhood walkability may be conceptualized as the degree to which the physical characteristics of the built environment may be conducive to or inhibitive of facilitating local residents to walk or cycle for leisure and recreation, exercise or transport to services or work place destinations. Aspects of land use, transportation, and community design have been identified as governing factors, influencing the extent to which residents are physically active with reduced dependence on automobiles. Handy (1992) stressed the importance of accessibility in this context, as she tried to assess the impact of alternative urban forms upon shopping travel pattern. She considered two components of accessibility, namely, micro-level local accessibility which calculated the closeness to local opportunities of activity and the macro-level regional accessibility associated with the degree of connectivity to large regional service destinations. Handy reported that any increments in both local as well as regional accessibility were associated with decrements in mean shopping distances; however not with the frequency of trips per se. In a subsequent study conducted on the San Francisco Bay Area, Handy (1996) highlighted the role of urban form,

concluding that residents of traditional neighbourhoods with higher physical accessibility to community resources are generally associated with a higher proportion of walk trips. Another important study was conducted by Frank and Pivo (1994) on the relationships between urban land use configuration and travel mode choice in terms of use of single-occupant vehicles (SOV), mass transit, as well as walking for shopping and work trips. They employed data from the Puget Sound Transportation Panel, the US Census Bureau and three local agencies in Washington State and reported that both their configuration indices of density and land use-mix were significantly associated with travel mode choice. In a pioneering work, Cervero & Kockelman, (1997) employed travel and socioeconomic data derived from the 1990-91 Bay Area Travel Survey (BATS), and data on land use design and configuration collected through field surveys of 50 sampled neighbourhoods in the San Francisco area, and introduced the concept of the 3D's - density, diversity and pedestrian oriented designs - as the dimensions of the built environment that have statistically significant influences on active transport. Subsequently, two more D's in the form of destination accessibility and distance to transit stops were added to the list to make it 5D's (Ewing and Cervero, 2001, Ewing et al., 2009). Lee & Moudon (2006) highlighted the importance of the availability of fine grained data and GIS analysis at intricate spatial levels in walkability research. They considered a set of objectively measured micro-scale built environment variables in their study, of which a small subset of built environment correlates of walking were isolated and grouped as destination, distance, density, and route i.e. 3D + R.

Researchers have therefore considered various groups of measures to assess the degree of walkability of urban neighbourhood environments. The identification of a reliable cluster of measures as well as the relative importance of each is still in contention, however. One of the major bottlenecks is the scarcity of micro-

scale data on built environmental variables as well as those related to nonmotorized activity. Another complication stems from the nature of the measures with some aspects of the built environment being easily captured through objectively measured variables (subject to availability of fine scale data) while, others are more subjective in nature. A review of studies suggests that a mix of quantitatively measured objective variables and surveyed subjective measure has typically been employed. There has been an increasing inclination to employ GIS-based objective measures, however, to operationalize the physical constructs of the microenvironment. Definitions of 'neighbourhood' have ranged from a 0.25 mile street network buffer around a respondent's house, to an entire census tract. Another inherent over-simplification originates from the fact that the definition of neighbourhood is fuzzy in nature. The question - how local is local? is difficult to answer as no clear cut quantitative definition exists and the answer is essentially based on the assumptions and purpose of the study. A study defining a neighbourhood in terms of a network buffer of 0.25 mile radius around a respondent's household is basically assuming that the built environment within the defined environment influences the health outcomes and that this influence is uniform across demographic scales. In reality, health defining behaviour such as physical activity is often determined by individual preferences which may depend on factors as age, race, gender, social class etc. However current definitions of neighborhood in health studies can seldom take in to account the attenuations produced on account of overlooking such individual characteristics. Furthermore, the characteristics of the urban built environment vary at the national, regional and global scales, which further hinder the use of a set of standardized measures. Most of the studies conducted in this field are cross sectional in nature which has been criticized for not addressing the issue of selective migration or self selection. There is therefore a need to construct longitudinal designs for the future studies. In reviewing the evidence from published studies, seven principal

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determinants of public health at the neighbourhood level seem to be important namely: density, diversity, destination accessibility (retail, green space, physical activity facilities, food environments), distance to transit stops, route connectivity, pedestrian oriented design (presence of pedestrian and cycling infrastructure, aesthetics, perception of safety), as well as the composite measures of built environment. The evidence for each of these is reviewed in the following sections, hypothesized causes as Factors with notations N1...Nn.

## 4.3.1 Factor N1: Density/Intensity

Density, one of the most widely used measures in urban planning, refers to the quantity of people, dwelling units, jobs, specific service destinations distributed per unit land area such as acre, square kilometer or square mile. This can be expressed as net or gross measures. Population density and residential density are one of the most commonly employed measures used in studies trying to correlate specific features of built environment with activity behaviour including walking. Another synonymous measure often been employed in built environment-health correlations is land use intensity. Land use intensity is often expressed in terms of counts or densities of specific service destinations in a defined neighbourhood. In GIS terminology, the neighbourhoods are defined by drawing an airline or network buffer of a predefined radius around a dwelling unit. The proportion of the area occupied by different categories of land uses or services is measured or the number of different facilities is simply counted. Density and intensity reflect the degree of mixed use in an area. The popularity of these measures originates from the ease of data availability at appropriate aggregated geographical scales and inherent computational simplicity. As the land use density increases, trip origins and destinations are brought into greater proximity to one another resulting in greater *accessibility* to service destinations.

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Consequently, high density compact neighbourhoods tend to shorten trip lengths, while increasing the number of trips. In contrast, the number of motorized trips reduces, resulting in higher demand for walking and cycling. High density has been associated with greater land use mix, reduced impervious surfaces in the form of parking lots, a greater fraction of low SES population, all of which discourage car dependence. Furthermore, higher demographic heterogeneity and cultural integration creates a physical sense of community contributing to greater community participation and social capital.

Studies examining the associations between attributes of built environment, health behaviour (such as physical activity, walkability) and health outcomes have employed diverse measures of density and intensity over the years. Ewing et al. (2004) considered measures of overall density (residents + jobs)/area) while, Frank et al. (2004, 2006) enumerated net residential density as the number of persons per residential acre in the census block group containing the household. Rutt and Coleman (2005) considered the number of individuals per square mile and operationalized land use as the percentage of non-residential buildings within a person's neighbourhood. Duncan and Mummery (2005) evaluated the number of active people in a 1-km radius of the respondent's residence. Li et al. (2005b) used variables for density of places of employment and density of households in their study. Norman (2006) as well as Kligerman et al. (2007) also included measures of residential density in their study while, Rundle et al. (2007) included population density. Lee and Moudon (2006a) calculated both the net residential density within 1 km catchment area as well as number of residential units in the household parcel. Wells et al. (2008) considered four categories of density in their neighbourhood design-walking correlation study: population density, employment density, housing density and service-job density. Brown et al. (2009a) considered the population density,
proportion of residents walking to work, as well as km<sup>2</sup> of each of the six land use categories present within the 1 Km street network catchment. In their study, Pouliou and Elliott (2010b) evaluated both residential density as well as the density of opportunities. Wood et al. (2010) operationalized their net residential density as the number of residential units per residential acre within 1 km road network catchment of a household. Yan et al. (2010) considered census tract population density, 3D-population density, as well as the number of housing units in the tract while, Troped et al. (2010) calculated the residential population density as well as housing unit density. Several other studies have tried to focus upon the health implications of urban sprawl based on a sprawl index whose primary components are the population density and residential density (Ewing et al., 2003b, Lopez, 2004, Garden and Jalaludin, 2009, Lee et al., 2009).

### 4.3.2 Factor N2: Diversity

Diversity or the land use mix measures the number of different land uses as well as their spatial arrangement for a given land area, floor area, or employment unit. They have been expressed in terms of the degree of mix; typically quantified as measures of entropy, mean entropy, floor area ratio, balance indices, Herfindahl-Hirschman index, dissimilarity indices and similar.

Cervero (1988) characterized mixed land use developments to be comprised of a multiplicity of offices, shops, restaurants, banks and other activities all amalgamated together. Studies have pointed to the fact that compact dense neighbourhoods are not only synonymous with high degrees of land use intensity, but also heterogenous mix patterns and integration resulting in agglomerations of services like retail, offices, schools, churches, health facilities etc. The resulting urban form thus comprises of fine grained neighbourhood blocks with enhanced permeability, connectivity and accessibility, thereby

reducing the necessity for longer trips. Indirectly, this may be beneficial to active travel and physical activity by reducing the impervious surfaces in the neighbourhood in the form of motorways and parking space for the spaceintensive automobiles. By maintaining an optimized neighbourhood land-use balance the diverse, yet essential uses are localized into relative proximity while, a diverse land-use mix supports integration of services at a much finer grain of proximity. Increased accessibility to services, shortened trip lengths within a neighbourhood have been known to diversify transit options. Cevero (1988) explained the advantages of mixed use urban settings in terms of the economies of travel mode - in the form of lower vehicular trip generation rates and higher non-motorized (e.g. walking, bicycling) modal splits, a more even distribution of trips throughout the day and week as well as new opportunities for shared parking arrangements. He reported a 3% increment in active travel in the form of transit and ride-sharing commutes with every 10% increase in commercial floor area. In a separate study of shopping trips of residents from four neighborhoods in the San Francisco Bay Area, Handy (1992) established that residents of traditional, mixed-use neighborhoods on an average made 2-4 more walk and cycle trips per week to their neighborhood retail stores than those living in close proximity to areas that were served primarily by automobile-oriented, strip retail establishments. In another study of six communities of Palm Beach County, Ewing et al. (1994) found that residents of suburban sprawling areas characterized by homogeneous land uses reported approximately 66% more percapita vehicle hours of travel (VHT) in reference to residents of mixed traditional neighbourhoods served by internal community services in the form of shopping, recreation, and school facilities. In another subsequent study, Cervero, (1996) was able to establish significant levels of association between the presence of community services including grocery stores within 300 feet of a respondent's residence and increased propensity for active travel after adjusting for residential

densities and vehicle ownership levels. Nonetheless, their presence between 300 feet and one mile of residences were associated with higher levels of autocommuting. This was attributed to the relative ease of efficiently linking work and shopping trips through vehicular trip, beyond the threshold of 300 feet. However, they had employed a relatively simple binary measure of land use mixture ranging 0-1; indicating the presence/absence of non-residential uses within some pre-defined neighbourhood.

At a different level, enhanced land use mix is expected to foster a sense of community and is associated with increments in social capital and resulting positive health outcomes. Compact neighbourhoods with considerable heterogeneity are able to combine diverse uses – dwellings, shops, supermarkets and food stores, offices, recreational facilities, green/open spaces, schools, places of worship and other uses, thereby encouraging walking which in turn promotes casual social contacts and a sense of community. Nasar and Julian (1995) conducted a series of twenty five interviews in four neighbourhoods of Upper Arlignton, Ohio, each of which differ with respect to land use mix (having one, two, three and four categories of land uses). They concluded that single use residential neighbourhoods were associated with a reduced sense of community as compared with those having multiple uses. In another study, Lund (2002) reported a similar trend, wherein increased sense of community was observed in traditional neighbourhoods manifested by distinctively accessible road network and an enhanced mix of diverse land use categories.

The quantitative approach to land use mix calculations was first operationalized as a land use balance measurement by Cervero (1989) in a pioneering study of the proportion of suburban employment centers. This originated from the concept of entropy, one of the fundamental principles of statistical thermodynamics. The theory of information entropy owes its origin to the pioneering works by Shannon and Weaver (1949) and employs probability and numerical statistics to express the degree of disorder in a system. The concept has since been expanded to find widespread cross-disciplinary applications in enumerating information entropies of social, economic, ecological systems; especially in assessing the degree of heterogeneity in the distribution of a certain attribute across *many* spatial neighbourhoods. Following this, Frank and Pivo (1994) employed cohort travel behaviour data from Puget sound Transportation Panel to study the impacts of urban form on travel mode choice at the level of census tracts. In addition to density, the entropy index was employed as one of the variables of urban form. They employed the following adapted version (normalized between 0-0.845) to measure the land use mix.

**Level of land use mix (entropy value)** =  $-[single family \cdot log_{10}(single family)] + [multifamily \cdot log_{10}(multifamily)] + [retail and services \cdot log_{10}(retail and services)] + [office \cdot log_{10}(office)] + [entertainment \cdot log_{10}(entertainment)] + [institutional \cdot log_{10}(institutional)] + [industrial/manufacturing \cdot log_{10}(industrial/manufacturing)]$ 

They concluded that density (both employment and population) and land-use mix were beneficially associated with transit usage and walking to work and shopping trips. In a similar vein, increases in density and land use mix resulted in decline in single occupant vehicle (SOV) usage for work and shopping trips. Furthermore, a recent study examining the impact of transportation, land-use, and the built environment variables upon individual health outcomes reported that every percent decrease in auto use would result in reductions in the odds of obesity (0.4%), high blood pressure (0.3%), high blood cholesterol (1.3%), and heart attack (1%) (Samimi and Mohammadian, 2009).

Rather than considering individual land uses, proportion of *developed* area under each of the uses are sometimes employed in order to avoid bias against an area that's evenly distributed with respect to the j uses but has a relatively small area (Kockelman, 1997). Bias may also originate in smaller tracts with relatively little area to accommodate a variety of land-use types and to more adequately represent the concept of "neighborhood". A "mean entropy" is also used to overcome such biases, as indicated below:

Mean Entropy = 
$$\sum_{k} \frac{\sum_{j} \frac{P_{jk} \ln (j)}{\ln (j)}}{k}$$

where K is the number of actively developed hectares in the census tract and  $P_{jk}$  is the proportion of developed area under use j and within a defined radius of the developed area surrounding the k<sup>th</sup> hectare.

In studies endeavouring to measure associations between built environment and health outcomes, the measure of land use mix (LUM) pioneered by Frank et al. (2004, 2006) is widely employed. It is quantified as follows:

$$LUM = \left(-\frac{\sum_{i=1}^{n} p_i . ln p_i}{lnN}\right)$$

where  $p_i$  is the proportion of estimated square footage of land use *i* and *N* is the number of land uses. The land use mix values normally range from zero to one, with zero representing a homogeneous, single land use environment, while one represents a perfectly heterogeneous neighbourhood comprising of all possible permutations and combinations of land use categories. In most of the studies, non-walkable land use destinations were excluded from the LUM scores. Land use mix may have both vertical and horizontal components. Vertical mixing, more

common in the most of the European cities and the older parts of American cities, comprises different land uses stacked together in a single building; usually retail on the ground floor and housing on top. Horizontal mixing is characterized by the presence of different types of land uses on adjacent or near adjacent parcels of land. Frank et al. (2004) measured the 4-category LUM, calculating the proportion of estimated square footage of residential, commercial, office and institutional uses within 1 Km network buffer from each participant's household. They concluded that land use mix had the strongest association with obesity; reporting a 12.2% reduction in the likelihood of obesity across gender and ethnicity with each quartile increase in land uses mix. Frank et al. (2006) employed a similar approach as their earlier study, to evaluate a six category score (single-family residential uses, multi-family residential uses, education, entertainment, retail and office uses) land use mix. Mobley et al. (2006) used an additional category for rural land in their LUM calculations and reported that BMI was lower by 2.60 kg/m<sup>2</sup> and CHD risk was lower by 20% in women living in an environment of maximum mixed land use as compared to those living in singleuse uniform environments. Cerin et al. (2007b) employed objective measures of land use mix in their study and reported no significant associations between land use mix and weekly minutes of walking for transport. Nonetheless, significant correlations were observed between land use profiles and walking for transport. Li et al. (2008) reported a 25% reduction in the prevalence of overweight/ obesity with 10% increases in land use mix. Forsyth et al. (2008) considered a range of parameters to reflect land use mix – entropy index, dissimilarity index, and the Herfindahl-Hirschman index; however, interestingly, they reported statistically significant but negative correlations with physical activity outcomes.

Brown et al. (2009a) discussed some of the limitations associated with land use entropy measurements, especially the insensitivity of entropy measures to

particular land use profiles. Two different categories of land use mix equations may produce the same mix scores; and the absence of a particular land use type may modify the walkability of the neighbourhood considerably, but may not alter the entropy score. Furthermore, the entropy score may sometimes confound the degree of walkability of neighbourhoods, so that it may emerge that the mix of a walkable neighbourhood may score equivalent to that of a less walkable cardependent neighbourhood. To partially overcome these issues, Brown et al. (2009a) employed 2-, 3-, and 6-category LUM scores and calculated the number of each of the six land uses within the defined neighbourhood in their study. They reported that the 6-category LUM score was the best predictor of BMI and overweight/obesity outcomes. Troped et al. (2010) estimated the land use mix across four categories (residential, commercial, recreational and urban public) and reported that significant beneficial association between land use mix and moderate to vigourous physical activity within a 1 Km home buffer. Pouliou et al. (2010b) employed measures of 5-category land-use mix index for two metropolitan cities of Toronto and Vancouver and concluded that residents of areas with mixed land uses exhibited improved weight outcomes than those living in areas with single or fewer land use types for Vancouver. However, no significant association could be established in the case of Toronto. Wood et al. (2010) considered measures of 3-category land use mixes of residential, commercial and office land uses within a 1 km network buffer as well as the commercial floor area ratio in their study and reported significant associations with their sense of community (SofC) score. However, contrary to the general trend, land use mix was inversely associated with SofC - those living in low mixed land use areas were 23.27% more likely to have a higher SofC score than respondents in a high mixed land use area. Expectedly, SofC was also positively correlated with higher commercial floor space to land area ratios. In another study Saarloos et al. (2011) reported similar results. A higher land use mix was

independently associated with higher odds of depression among older men. On the contrary, Leslie and Cerin (2008) reported that a more heterogeneous land use mix was beneficially associated with four of the five domains of neighbourhood satisfaction, namely safety and walkability, access to destinations, social network and travel network which in turn acted as independent predictors of mental health.

Several indices of balance have also been employed to reflect the diversity of the urban neighbourhoods. In their studies, Cervero and Duncan, (2003) employed residents-to-jobs balance index, and employed residents-toretail/services balance index within 1 mile of the trips origins and destinations:

Employed residents-to-jobs balance index (within 1 mile of origin) = 1 - {|ABS(ER - JOBS)| /(ER + JOBS)}

Employed residents-to-retail/services balance index (within 1 mile of origin) = 1 - {(|ABS(ER-RS)| / (ER + RS)}

...... (Cervero and Duncan, 2003, pg. 1480)

where ABS = absolute value; ER = number of employed residents; JOBS = number of workers; RS - number of retail/service jobs.

In another study, Ewing et al. (2004) employed measures of jobs-residence balance, job mix, each index ranging from 0-1. Jobs-residence balance reflected the degree of land use balance between jobs and residents within proxy neighbourhoods of traffic analysis zones (TAZs) while, job mix quantified the degree of homogeneity of distribution of jobs among the various employment sectors and indicated the degree of land use mixing at the TAZs level and defined as:

Job mix =-[commercial jobs × ln(commercial jobs) + industrial jobs × ln(industrial jobs) + service jobs × ln(service jobs)]/ln(3)

...... (Ewing et al., 2004, pg. 58)

Wells and Yang, (2008) used land use mix measures of jobs-per-resident ratio and service-worker-to-resident ratio which reflect the prevalence of nonresidential land uses in the neighbourhood. In contrast to the general trend, they reported that increases in service-worker-to-resident ratio (increased nonresidential uses) were associated with less walking. Norman et al. (2006) calculated land use mix within each 1 mile street network buffer as the geometric mean of residential, institutional, entertainment, retail and office acreage. A higher land use mix score indicated a more diverse land use. However, they could not establish any significant association between mix score and adolescent physical activity or BMI. Rundle et al. (2007) considered the balance of commercial and residential uses in their study of the impact of urban form on obesity in New York City. They calculated the ratio of building area devoted to commercial use and residential use for each census tract. The two ratios were multiplied by one another and then scaled by a factor of four to arrive at an index which ranged from zero to one. Thus, for a perfectly mixed area-containing equal proportions of residential and commercial space, the index returns a value of one while, whenever either type of use dominated, the index moves towards zero. They found that land use mix scores are inversely and significantly associated with BMI outcomes. Boer et al. (2007) considered the number of different types of businesses in a neighborhood to parameterize their mix measures. They reported that moving from two different business types to three types significantly improved the probability of walking. Similar improvements in

walk propensity were reported when moving from three to four different business types in the neighbourhood.

The Herfindahl-Hirschman index has usually been employed to study market concentrations, especially to identify potential monopolies but has also been used for the characterization of land use mix (Forsyth et al., 2008, Yan et al., 2010). It is expressed as the sum of squares of the percentages of each type of land use in the user-defined neighborhood. A higher HHI score indicates a lower level of land use mix.

Another indicator of land use heterogeneity is the extent to which the diverse land uses are in contact with one another; often parameterized as dissimilarity index (Kockelman, 1997). It may be expressed as:

Dissimilarity Index = 
$$\sum_{k} \frac{1}{K} \sum_{i}^{8} \frac{X_{ik}}{8}$$

where K is the number of actively developed hectare in the census tract and  $X_{ik}$  =1 if the central active hectare's use type differs from that of a neighbouring hectare and  $X_{ik}$  =0 otherwise. This index has also been employed in the study conducted by Forsyth et al. (2008).

Generally, what may be concluded from these diverse approaches to measuring the association between land use mix and physical activity and health outcomes is that higher mix is generally synonymous with the presence of diverse destinations, shorter trips lengths, and hence a more permeable and walkable neighbourhood. Many of the studies have reported expected positive association of land use mix and physical activity and body mass index. Nonetheless, some of the studies have reported counterintuitive findings for example those conducted by Wood et al. (2010) who found a negative association between land use mix

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and sense of community in Metropolitan Atlanta. Thus, although a high land use mix may represent a walkable community, nonetheless it is also a manifestation of high density and economic activity, impervious surfaces and hence may be associated with micro-level deterrents to health (such as overcrowded streets, traffic pollution, lack of safety from traffic etc), more so in purely urbanized areas. This has perhaps been captured in the study conducted by Saarloos et al. (2011) who report a positive association between land use mix and prevalence of depression in older adults in Metropolitan Perth.

## 4.3.3 Factor N3: Destination accessibility

A healthy neighbourhood should strive towards optimized clustering of healthpromoting community services at a local level. Destination accessibility measures the degree of residential proximity to community facilities and services. The location of key local infrastructure (retail, healthy food provision, healthcare facilities, educational institutions green space etc.) in the spatial matrix relative to the residential units has been known to have an impact on health. Besides promoting a range of viable job opportunities or attractive destinations, easier destination access implies multi-purpose short trips, thereby encouraging residents to walk and cycle as well as reducing dependence on cars. Indirectly, with more destinations closer to one another, there are more people on the streets fostering a sense of community. Thus, healthy urban planning will entail clustering of the facilities along the local high streets and town centres, with equal impetus on maintaining a mix of appropriate housing density. Most studies looking at these issues have sought to measure the proximity to and density of various community resources.

## Factor N3.1: Retail

Retail in the form of shops and commercial establishments act as a choice destination and its density has been extensively employed in several studies of physical activity behaviour and related health. In their study, Giles-Corti et al. (2003) reported a positive association between obesity and perception of no shops within a walking distance. Handy et al. (2006) used objective neighborhood characteristics including number of types of service establishments within 400, 800, and 1600m street network distance and concluded that close proximity to potential such as shops and services destination acted as the most important predictors of walking. Lee and Moudon, (2006) considered the log count of the number of retail stores within 1 km buffer, but found no significant association with recreational walking. Forsyth et al. (2008) evaluated GIS-based measures of the percentage of total land area occupied by major land uses, employment per unit land area, retail employment per unit area and density of employees in the various retail sub-categories but did not report any significant findings. In their study, Cerin et al. (2007a) performed a two step cluster analysis to aggregate similar census collection districts into three groups: residential, recreational and commercial/industrial. They reported that the residents of neighbourhoods with commercial/industrial LUM had significantly higher transport-related walking as compared to the residents of neighbourhoods with a recreational profile. However, in another Australian study, Saarloos et al. (2011) considered the retail availability within census collection districts as proxy neighbourhoods. They reported higher prevalence of depression among older adults in neighbourhoods with retail. Nagel et al. (2008) considered the number of commercial and select establishments within a 0.25 and 0.50 mile buffer and reported a beneficial association with the total walk time. Similarly, Sallis et al.

(2009a) reported a beneficial association between physical activity prevalence and presence of shops within 10-15 minute walk distance.

Retail floor area ratio (FAR) is another variable of importance in built environment health correlation studies. High commercial FAR in the neighbourhood indicates that a major fraction of the land parcel is occupied by build-up construction, while leaving the rest for open impervious surfaces such as parking space and landscaping. Such a configuration implies that the built-up retail outlets are accessible to pedestrians, being more or less adjacent and in close proximity to sidewalks. On the other hand, a low value is reflective of that fact that only a fraction of the parcel is taken up by buildings, the rest usually being allotted to parking. High commercial FAR has been found to be a manifestation of pedestrian oriented design while, a low FAR value is indicative of automobile oriented design. Norman et al. (2006) computed the average retail-FAR for commercial land parcels within 1-mile network buffer. They reported a positive association between retail floor area and physical activity of adolescent boys. Wood et al. (2010) considered the commercial FAR within 1 kilometer street network buffer and reported a beneficial association between high commercial FAR and sense of community. Several other studies that evaluated commercial FAR and employed it as one of the components of their composite walkability index (Frank et al., 2006, Kligerman et al., 2007, Sallis et al., 2009b, Owen et al., 2010). In another study a positive association was reported between walkability and smaller size of closest office complex (<36,659 sq m) as well as longer distance to closest office/mixed-use complex (>544 m) for the King County, Washington. The composite walkability score developed comprised eight components including the afore-mentioned and was beneficially associated with walking and lower odds of depression. (Berke et al., 2007b, Berke et al., 2007a).

In conclusion, there is almost unambiguous evidence of a positive association between the presence of retail on the one hand and physical activity and improved weight outcomes on the other. This is attributed to retail being an attractive destination and hence encouraging walking and social interaction. Only one study, conducted by Saarloos et al. (2011), report evidence to the contrary. This may be attributed to the fact that the study focused on the psychological health of older adults in a metropolitan area.

#### Factor N3.2: Accessibility to Green space

The role of green spaces (in the form of green parks, squares, pocket parks, playgrounds etc) in promoting community health is a multiple one. Green spaces provide natural pollution-free environments and hence are associated with many possible direct positive health outcomes. They act as natural sieves that absorb and dilute urban pollution; act as catchment area for water harvesting; improve drainage and ground water quality; maintain species biodiversity; help in CO<sub>2</sub> sequestration; and can lessen the heat island effect in an urban setting. Green spaces provide habitats for individuals to relax in a serene natural environment and hence are associated with recreational and aesthetic value, with potential mental and physical health related outcomes. The presence of green space in a neighbourhood has been associated with enhanced recreational walking and cycling. Residents tend to spend more of their spare time outdoors, thereby contributing to greater physical activity. The presence of green spaces in compact, high mix neighbourhoods tends to provide an incentive to walking to work and shops, thereby resulting in lower vehicle hours traveled (VHT). In addition, they act as the places where local residents tend to assemble and thus can foster a sense of community, with associated health benefits. With more than 50% of the world's population presently residing in urban settlements, daily

exposure to green spaces is fast becoming rarer thereby underscoring the importance of access to neighbourhood green space for promoting healthy behaviour and enhancing the quality of life (UNFPA., 2007, Chiesura, 2004). A survey of cities participating in the WHO European Healthy Cities network have highlighted the stark cross country disparity in accessibility to green space. In an inter-national study of selected cities, almost all of the Northern European residents of Brussels, Copenhagen and Glasgow could access neighbourhood green space within fifteen minutes; while only 47% of those in the cities of Bratislava and Kiev could do so (Tsourou, 1998). In a study conducted in Dutch cities, de Vries et al. (2003) reported a decrease in the number of symptom comparable with a decrease in age by 5 years with every 10% increase in green space in the neighbouring environment. In a study of physical activity of 1281 residents of Rockhampton, Queensland, Duncan and Mummery (2005) reported that the respondents having the nearest parkland beyond a network distance of 0.6 km had a 41% higher odds of achieving recommended levels of physical activity as compared to those with parkland within the distance. Again, the respondents with direct route connectivity to the nearest parkland had were 41% less likely to achieve sufficient levels of physical activity than those who resided in areas having indirect route connectivity to parkland. In another study, Maas et al. (2006) noted that people with greener environment (both agricultural and natural green) within 1 Km or 3 km radius enjoyed better self perceived general health. The relationship between green space and health was observed to be stronger for people with low SES as well as the youth and elderly. Nielsen and Hansen (2007) employed self reported measures of distance to eight categories of green areas as well as frequency of visits to them. They reported that proximity to publicly accessible green areas as well as access to a private garden or a shared green area at the dwelling were associated with less stress as well as lower likelihood of obesity. However, the frequency of utilization of green areas in

the study could not explain the association between green areas and health. Kaczynski et al. (2010) studied the relationship between potential likelihood of a park being used for physical activity and adjacent land use diversity and highlighted that land use mix may act as a disincentive to park use. They reported that parks located in neighbourhoods with low land use diversity but with higher number of facilities were significantly more likely to have been used for physical activity as compared to those having high adjacent land use diversity and high facilities. In another study, Troped et al. (2010) measured the landscape greenness within a 1 km buffer of a respondent's home in terms of the average Normalized Difference Vegetation Index (NDVI) score calculated from the Landsat ETM+ satellite imagery. Interestingly, their greenness score was inversely associated with physical activity. The relative influence of green space upon physical activity was perhaps subordinated in this study by the presence of highly dense and intricately connected urban form. In another study, Tilt et al. (2007) examined the impact of both objectively measured as well as self-reported destination accessibility and vegetation upon walking trips and body mass index. Objective measurement of greenness was based on the NDVI index. Both objective accessibility and subjective greenness were positively associated with walking trips per month. Respondents residing in areas of high accessibility and high NDVI measured greenness reported lower BMI. Another longitudinal study conducted over a period of 8 years on 3173 children aged 9–10 from 12 communities in Southern California, Wolch et al. (2011) reported that both park space (in acres) within a 500 metre buffer as well as the number of recreation programs within a 10 km buffer of children's homes were beneficially associated with weight outcomes.

Besides promoting physical activity, evidences also suggest that exposure to green spaces have also contribute to improved mental health outcomes via

diminishing stress and providing opportunities for recovery as well as enhanced levels of physical activity and social cohesion (Ulrich, 1984, Hartig et al., 2003, Pretty et al., 2005). In a study of relationship between green public areas and longevity among 3114 senior citizens, Takano (2002) reported that living in areas with walkable green spaces was positively associated with longevity over the subsequent five-year period. In another study comprising of 953 randomly sampled respondents from nine Swedish cities, Grahn and Stigsdotter (2003) had reported independent association between the utilization of urban open green spaces and self-reported experiences of stress after adjusting for the respondent's age, sex and socio-economic status. The distance to public urban open green spaces and access to a garden were identified as the key factors in the study. Pretty et al. (2005) highlighted the importance of green exercise, reporting that exercise in pleasant environments has a greater effect on cardiovascular health measures of blood pressure and measures of mental health than exercising elsewhere. In another study conducted over 1895 adults in Adelaide, Australia, Sugiama et al. (2008) reported that better perception of neighbourhood greenness was associated with 1.37 and 1.60 times higher odds of reporting improved physical and mental health respectively in reference to respondents having poorer perception of neighbourhood green. Furthermore, perceived greenness was independently associated with walking for recreation, social capital and local sense of community. Another large-scale study conducted by Mitchell and Popham (2008) in England reported that the populations exposed to greener environments exhibited lower levels of income deprivation-relatedhealth inequalities in all-cause mortality and mortality from circulatory diseases. The incidence rate ratio (IRR) for all-cause mortality for the most income deprived quartile was 1.93 times higher as compared to the least deprived in least green areas. While the same was relatively low, only 1.43 times higher in the most green areas. In another study of elder adults conducted in Bogotá, Columbia,

Parra et al. (Parra et al., 2010) reported a beneficial association between self rated health and greater than 8% of the land being covered by public park spaces. In a meta analysis of 10 UK studies involving 1252 respondents, Barton and Pretty (2010) reported that acute short-term exposures to facilitated green exercise had a significant beneficial effect on both self-esteem and mood independent of duration, intensity, location, gender, age, and health status.

In a nutshell, there is fairly conclusive evidence of positive associations between neighbourhood accessibility (expressed as either proximity to or density of) green and open spaces and physical activity, general health and mental health. Besides being attractive destinations where people can walk to, they also provide therapeutic stress relieving environments as well as environments for social interaction and bonding.

# Factor N3.3: Accessibility to recreational facilities and physical activity resources

The presence of accessible recreational/physical activity (PA) facilities in the local neighbourhood complements an individual's effort to stay physically active and healthy and a mounting body of evidence has highlighted the beneficial association between the availability and improved access to recreational/PA resources and physical activity levels. Most of these studies have endeavoured to objectively measure the number of the selected types of recreational/PA facilities as well as enumerate the shortest distance to such facilities, while other studies have depended upon perceived proximity to facilitates. In a study conducted by Sallis et al. (1990), individuals' perceptions of the convenience of physical activity facilities were not associated with objectively measured density of physical activity facilities. Giles-Corti et al. (2003) used GIS-based measures of proximity of eight categories of recreational facilities (sport and recreation centers, gyms,

golf courses, tennis courts, swimming pools, public open space, and the beach or river foreshores) from a respondent's dwelling location. They reported that reduced access to four or more recreational facilities were associated with a 68% higher odds of being obese in reference to those with improved access. In another study, Rutt & Coleman (2005) considered the number of physical activity facilities in the form of parks, gyms, schools, and biking/walking paths within a 2.5 mile-radius catchment around each subject's home as well as the proximity (shortest distance) to each of the nearest physical activity facilities. They reported significant associations between walking frequency and number of physical activity facilities. In a study of inequalities in physical activity among the 78 neighbourhoods of Eindhoven, van Lenthe et al. (2005) tried to characterize the general attractiveness of the neighbourhood, the proximity to neighbourhood facilities as well as neighbourhood safety, using survey questionnaires and scale measurements of 1-5. Quality of green facilities and availability of sport and recreational facilities were also considered. Residents of neighbourhoods with the poorest proximity to sports facilities reported higher odds of almost never participating in sports and physical activity. In a study of neighbourhood level environmental correlates of adolescent physical activity and BMI outcomes, Norman et al. (2006) enumerated the number of private and public recreational facilities and parks within the 1-mile network catchment of each respondent's dwelling. They reported significant associations between moderate-to-vigorous physical activity (MVPA) and the number of recreation facilities, as well as number of parks, but, only in case of girls. However, the community design as well as access to recreation variables was not observed to be significantly related to BMI-outcomes. Jilcott et al. (2007) considered both perceived and objectively measured proximity to physical activity resources. Perceived proximity to PA resources was based on proximity to nearest school, gym or recreation center; park and the presence of school, gym or recreation center; and park within a 10-

minute driving distance from home. Objectively measured proximity was parameterized as road network distance of the participants' home to closest PA resource and the number of each type of PA resource in a 1- and 2-mile crow-fly buffer. The study found no significant relationship between physical activity and proximity to parks, both in cases of perceived and objectively measured predictors. Nonetheless, counter-intuitively, the number of resources within the buffer was negatively associated with MVPA. Both the predictors of perceived distance to gyms as well as objectively measured number of schools within 1mile buffers were also negatively associated with physical activity. In another study, Gordon-Larsen et al. (2006) calculated the number of physical activity facilities per census block and reported a higher odds of achieving MVPA in census blocks with higher number of facilities relative to those with zero-facilities per block group. Kligerman et al. (2007) employed two recreation-based environmental variables of shortest distance to the nearest public or private recreation facility, and the total number of recreation facilities within the street network buffers of 0.25-, 0.5-, and 1 mile. They could not find any association between their measures of proximity and intensity of recreation facilities and physical activity or BMI. Boehmer et al. (2007) evaluated the number of recreational facilities and non-residential destinations within a 400 metres radius surrounding each respondent's residence as an objective measure of the availability of recreational facilities; no significant association with obesity could be determined. Diez Roux et al. (2007) considered the density of recreational resources (team sports, dual sports, running areas, water activities, tai-chi, pilates, yoga, martial arts; aerobics, cardiovascular equipment weight training; gymnastics and dancing; skating, skiing; golf; others) as well as the number of parks in windows of varying radii (0.5-, 1-, 2-, and 5-miles) around each participant's residence. They reported that the density of physical activity resources within neighbourhoods of 1 mile to 5 mile was beneficially associated

with higher odds of achieving recommended physical activity levels. These associations were observed to be slightly stronger among minority and lowincome residents. In another large scale study based on large public health surveys in suburban and rural areas of southern Sweden, Bjork et al. (2008) reported that the number of recreational values of natural environment (expressed in terms of serene, wild, lush, spacious and culture) in the neighbourhood of residence was beneficially associated with neighbourhood satisfaction and physical activity. The association was significantly higher among tenants. Furthermore, tenants residing in areas with higher recreational values exhibited higher odds to report low or normal body mass index. Pan et al. (2009) characterized the availability of physical activity facilities in terms of the number of sites to safely walk, ride a bike safely, number of publicly owned multi-purpose recreation trails, number of facilities, places and programs that are designed specifically for physical activity and sports, and number of other places that could be used for physical activity. Physical activity facility availability was observed to be more strongly associated with higher levels of physical activity among respondents with a university degree in reference to those with a lower level of educational attainment. In another cross continental study encompassing 11 countries, Sallis et al. (2009a) considered the presence of free or low cost recreational service as one of the components of the developed neighbourhood environment index. Higher levels of physical activity were reported to be associated in neighbourhoods having more low-cost recreational facilities.

As per the underlying hypothesis in this thesis, studies have consistently reported evidence of positive health benefits from the presence of sports and physical activity facilities. In these studies the health-promoting benefits operate via physical activity related mechanisms. Nonetheless, a few studies have reported null findings. An explanation may be that the use of a particular sports/

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recreational facility may be governed by individual affinities rather than by availability within a defined neighbourhood. In other words, the presence of a facility may not imply its usage as long as it is the type of facility that an individual chooses to use. In terms of the economics of service provision and planning, this implies that such services are not perfectly substitutable for each other, meaning that people cannot therefore be expected necessarily to use their nearest. Thus, models further controlling for the presence/ absence of facility within a neighbourhood which is unique for a respondent may further refine these studies; as will studies that use a finer classification of service/facility type.

### Factor N3.4: Accessibility to local food environments

Unhealthy high calorific food consumption has long been known to be one of the contributory causes of obesity. Food environments, especially the availability and access to healthy food have been one of the research domains within the contextual determinants of physical activity and healthy weight outcomes. Several studies have tried to establish associations between access to supermarkets, restaurants and fast food outlets, groceries etc. and obesity outcomes. Mobley et al. (2006) considered facilities per capita, for example, the number of fitness facilities, full-sized grocery stores, fast food establishments, restaurants, and minimarts per 1000 residents for each zip code of residence. They also considered the % of the workforce commuting outside county. Increment in fitness facility per 1000 residents was associated with lower odds of BMI and CHD risk outcomes; however, none of the food environment variables were significant. In another study Inagami et al. (2006) reported that respondents residing in socially deprived areas and shopping from grocery stores located in deprived areas exhibited higher BMI. Furthermore, car owners travelling farther to shop also had higher BMI levels. The Atherosclerosis Risk in Communities

(ARIC) Study conducted by Morland el al. (2006) examined the association between local food environment and prevalence of cardiovascular disease risk factors. They considered all types of food stores and food service places including supermarkets, grocery stores, convenience stores, full service restaurants, franchised fast food, and other limited service restaurants per census tract. The availability of supermarkets was associated with lower odds of obesity and being overweight, however, the availability of grocery stores and convenience stores was associated with an increased prevalence of overweight and obesity. Another large scale study of 714,054 adults based on the data from the 2002–2006 Behavioural Risk Factor Surveillance System reported that the density of fast-food restaurants and a higher ratio of fast-food to full-service restaurants were associated with higher BMI and obesity outcomes (Mehta and Chang, 2008). However, reduced odds of obesity were observed in areas having higher density of full-service restaurants. In the study, the restaurant density was measured in terms of the number of restaurants per 10,000 residents and the restaurants were further classified into fast-food or full-service categories. Li et al. (2008) operationalized the local food environment in terms of the number of fastfood outlets per unit area of census block groups and reported a 7% increment in overweight/ obesity with every 1-SD increase in the density of fast-food outlets. In a subsequent short term longitudinal study conducted over a period of 1 year, Li et al. (2009a) reported a similar trend. Residents of neighborhoods with a high density of fast-food outlets who utilized such facility more frequently reported increments of 1.40 kg in weight and 2.04 cm in waist circumference. In contrast, the residents of high-walkability neighborhoods participating in vigourous physical activity were associated with decreases of 1.2 kg in weight and 1.57 cm in waist circumference. Dangel et al. (2009) studied the association between metabolic syndrome (METS) and neighbourhood environment in adolescents. The density of food and physical environment resources (convenience/ gas stations, grocery

stores, and large grocery stores) were calculated within a 1600 metre network buffer of a respondent's dwelling. The proximity to nearest facilities especially the nearest parks, gym, recreation center, walking/biking trail and school were also calculated in reference to the respondent's dwelling locations. Higher distance to convenience stores was significantly associated with lower METS score (indicating lower odds of development of METS). Black et al. (2010) considered the number of supermarkets, restaurants, emergency food providers, small grocers, fast food outlets, beverage and snacks stores and physical activity facilities per 100,000, as well as the % residential and commercial land use in 34 New York City neighbourhoods. They reported a significantly reduced risk of obesity with increasing availability of large supermarkets, restaurants as well as fast food outlets and beverage/ snack food bars. Also, there was a reduced risk of obesity with increasing access to fitness facilities and commercial land use. In another study conducted by Burgoine et al. (2011), the number of food outlets was population-standardized for each census-defined middle super output area (MSOA) level and expressed in terms of food outlets per thousand population in the MSOA. Quintile scores were calculated at the MSOA level and subsequently converted to lower super output areas (LSOA) level that acted as proxy neighbourhoods. However, the study did not report any significant relationship between food availability and BMI levels.

Some studies have been able to establish a direct positive association between the availability of unhealthy food (fast food outlets etc.) and prevalence of obesity, while the presence of healthy alternatives (supermarkets) have been associated with lower odds of obesity. Future potential studies need to find a standardized classification system for categorizing food environments. To have clearer and robust evidence, in addition to the measures of density and network distance to the food environments, survey data on actual visits to various

categories of food environments need to be employed in epidemiological models. Furthermore, there is a necessity to develop more intricate measures of physical activity - obesity - heath models taking into account the highly individualized routines people follow in their daily lives for example, differentiating between walking vs. household chores in accelerator based measures of physical activity so as not to underestimate the total effect of context on individuals (Michael and Yen, 2009).

### 4.3.4 Factor N4: Street network morphology and connectivity

Street network morphology influences street level accessibility thereby shaping individual travel and physical activity behaviour. Typically, dense urban grids comprising highly interconnected straight streets crisscrossing at right angles are manifestations of archetypal highly connected networks. This gives rise to fine grained urban blocks with high degree of permeability, connectivity and accessibility. In contrast, sparse suburban grids tend to comprise 'loops and lollipops' formed by narrow curving residential streets that feed in to fewer arterial roads. The characteristics of street networks indicate the ease with which various service destinations can be reached because they influence trip route choice and mode of transportation. The US National Data points toward the fact that journeys within walkable catchments of half-a-mile and a-mile constitute up to 14% and 27% respectively, while those within bikeable distances of 5 mile constitute 63% of all journeys made (Federal Highway Administration., 1994, Sallis et al., 2004). In another study, Ross and Dunning (1997) highlighted the fact that 83% of all journeys are inherently short and for non-work purposes, occurring in the relative vicinity of home locations and well within walkable and bikeable distances.

Connectivity or route directness indicates the ease of travel between trip origins (home location) and various destinations (work place, community centre, park,

recreational centre, supermarkets etc) following the existing configuration of urban network. A street network with high road intersection density shortens the access distance and thereby provides more routing options. In studies assessing the effects of urban morphology and street network accessibility upon activity behaviour and health, the various attributes of street network morphology have been enumerated by objectively measured GIS-variables, often parameterized in the form of intersection density, percentage of 4-way intersections, number of intersections per unit length of street network as well as block based measures such as block perimeter, block size and so on.

Frank et al. (2004) quantified connectivity in their study as the density of intersections with more than three legs within a 1 Km household network catchment, but reported non-significant associations with BMI outcomes. They attributed this to the spatial collinearity between the land use diversity and street connectivity measures in high density urban areas. Ruth and Coleman (2005) measured intersection density in terms of the total number of intersections within a 0.25 mile radius. They also included the percentage of cul-de-sacs and 4-way intersections in their analysis. However, they found no significant association with BMI or physical activity outcomes. In their study, Nelson et al. (2006) employed street connectivity as one of the attributes to classify neighbourhoods in to six distinct cluster classes, namely rural working class, exurban, newer suburban, upper-middle class and older suburban, mixed-race urban and lowsocioeconomic-status (SES) inner-city areas. Their connectivity measure was operationalized within a 3 Km buffer and had the following components: density of 3-way and 4-way intersections, an  $\alpha$  index which is the ratio of observed to maximum possible route alternatives between nodes, a y index which is the ratio of observed node linkages to the maximum possible links in the network and a cyclomatic index which is the number of route alternatives between nodes. They

also considered road type expressed in terms of the proportion and total length of A1 and A4 roads within a 3 Km buffer. The study reported that the adolescent residents of rural working-class, exurban neighbourhoods had a higher odds of being overweight compared those in newer suburbs. Adolescent residents of older suburban areas reported a higher propensity to be physically active in reference to those of newer suburbs, while adolescents living in low-SES innercity neighbourhoods were also reported to be more active though not significant. Rundle et al. (2007) expressed intersection density as the number of street intersections per census tract and reported no significant association between intersections density and individual BMI. Forsyth et al. (2008) considered several variables as quantitative representations of street patterns. These included average and median census block area, number of access points, road length per unit area, intersections per unit area, ratio of 4-way intersections to all intersections, 4-way intersections per unit land area, ratio of 3-way intersections to all intersections connected node ratio, median perimeter of the block, and ratio of the area within X street distance to area within X distance radius. However, the study reported negative association between travel and leisure walking and street pattern expressed in terms of intersections per unit area. Brown et al. (2009a) considered the intersection density of three or more local streets within a 1 Km network catchment (excluding street intersections involving interstate highways) in their study. They reported non-significant associations with BMI, overweight, and obesity outcomes. In their study of neighbourhood level correlates of the sense of community (SofC), Wood et al. (2010) considered density of intersections with more than three legs contained within the household buffer as the measure of street connectivity and reported non-significant association. In another study, Burgoine et al. (2011) parameterized connectivity by summing up the number of street intersections within each census defined proxy neighbourhood (lower super output areas) and thereafter standardized by the

size of the respective neighbourhood. However, the study did not report any significant association with BMI. Recently, Ball et al. (2012) employed a connectivity index of each data zone for the city of Glasgow comprising seven component measures: direction density, intersection density (for 3 or more directions of travel), cul-de-sac density, street density, length density, beta index (ratio between links and intersections) and eta index (average length per link). However, no significant association was reported between street connectivity and BMI or BMI categories.

In a multilevel study, Li et al. (2005a) reported a positive association between the number of street intersections per unit area of neighbourhood and walking activity at the neighbourhood level. Norman et al. (2006) measured intersection density as the number of street intersections per acre of a 1-mile street network buffer around the participant's dwellings. They reported that intersection density was negatively associated propensity for moderate-to-vigorous physical activity only in the case of adolescent girls, while no association was observed in the case of boys. Boer et al. (2007) reported significant associations between measures of the fraction of 4-way intersections and average length of the long side of a city block in a neighbourhood with observed walk propensity in ten US metropolitan areas. Moving from areas with 0-24% 4-way intersections to areas with 25%-49% resulted in a 36% increase in propensity to walk, while moving further up from 25%-49% to the level of 50-74% 4-way intersections resulted in an increase of 38%. Neighborhoods with 75%-99.9% of four-way intersections promoted more walking compared to the level of 50%-74%. However, the association between block length and walk propensity was somewhat contrary to expectations. It was observed that moving from block lengths less than 600 feet to 600-804 feet resulted in an increase of the probability of walking. Li et al. (2008) considered the number of street intersections divided by the area of the

census block in square miles as their measure of density of street connectivity and found that neighbourhoods with high street connectivity were significantly related to higher prevalence of walking activity and meeting physical activity recommendations. Well & Yang (2008) characterized the street network by the total linear length of streets, number of street intersections and number of cul-desacs within 0.25 mile street network buffer. In their longitudinal analysis of walking levels prior to and after relocation to new neighbourhoods in four towns of south east US states of Georgia, Alabama and Florida, they reported that relocation to neighbourhoods with fewer cul-de-sacs was associated with increments of 5303 steps per week (or 757 more steps per day) after controlling for demographic variables. Gomez et al. (2010) operationalized street connectivity in terms of the number of street links divided by the number of street nodes within a 500 metre buffer of the neighbourhood centroid and reported that the residents of high connectivity neighbourhoods were beneficially associated with walking for at least 60 minutes. In another study, Troped et al. (2010) operationalized intersection density as the number of intersections within a 1 Km network buffer divided by the total street segment length. They reported a positive significant relationship between their calculated intersection density and levels of moderate to vigourous physical activity (MVPA) within a 1 Km home buffer. Contrastingly, intersection density was inversely associated with MVPA within a 1 Km work buffers and the relation was non-significant.

In a nutshell, the evidence of association between street level configuration and health are mixed and it is hard to draw general conclusions. A majority of studies have reported null results while, a fraction have established significant associations. However, the direction of association depends upon the overall city structure and is also related to the availability of facilities. On the one hand, enhanced connectivity can encourage physical activity and social interaction on

account of improved accessibility to choice destinations (as in the studies reported by Li et al. (2008) and Troped et al. (2010)). On the other hand, increasing intersection density may equally well be a manifestation of higher transit congestion, increasing levels of pollution and overcrowding and reduced perception of street level safety. Furthermore, the effects may be different in high density urban areas and low density suburban areas.

I wish to bring to the fore two weaknesses in the studies discussed above. One of the weaknesses of the connectivity metrics employed thus far stems from the fact that they are rather disjointed from land use and other socio-economic processes and hence, may not be a realistic representation of degree of usability of a particular street link. It is, after all, the land use and the socio-economic processes that exist adjacent to the street are the primary determinants of pedestrian and transit behaviour. Secondly, studies have rarely taken in to account the impact of street level morphology upon behaviour and thereby on patterns of physical activity and health. Network accessibility and movement potential at multiple spatial scales need to be assessed. For example in a suburban area, higher accessibility and movement potential at a local scale may be synonymous with higher social interaction and cohesion. On the contrary, parts of the network with higher transit level accessibility tend to be more motorized and less pedestrian friendly, with the potential to produce detrimental affects upon individual health outcomes. In the subsequent chapters, I have employed a street network modelling technique to overcome these deficiencies.

# 4.3.5 Factor N5: Access to public transit stops and stations and active transport

The use of public transportation options reduces reliance on private vehicles and has been associated with enhanced levels of physical activity in the form of

exercise through walking and subsequent health benefits. The presence of public transport services at walkable distances tends to encourage residents to walk to and from the bus stops or the light rail stops. In Europe, the threshold distance is around 400 meters beyond which the proportion of residents opting to walk declines progressively and the corresponding car dependence rate increases. Physically active commuting to work (PACW) has been associated with several direct health benefits in the form of reduced HDL cholesterol (Vuori and Oja, 1999) and reduced cardiovascular risk factors (Hu et al., 2002). Besser & Dannenberg (2005) estimated that in a sample of 3312 public transit users from the 2001 US National Household Travel Survey (NHTS), a median of 19 minutes daily were spent walking to and from stops with approximately 29% of the respondents exceeding 30 minutes of daily physical activity. Cerin et al. (2007b) considered perceived proximity to bus/train stops in their study, but they didn't report any significant association with walking. In a study of the associations between built environmental variables and BMI outcomes in New York City, Rundle et al. (2007) considered access to public transit as one of their measures. They measured the availability of public transit in terms of density of bus stops and subway stations per Km<sup>2</sup> in each census tract. They reported that availability of public transit showed inversely significant association with BMI after statistically controlling for individual- and neighborhood-level socio-demographic attributes. Wener & Evans (2007) found that the train commuters on an average walked 30% more steps per day, equivalent to ten minutes or more walking than the automobile commuters and were four times more likely to meet the standard recommendation of 10,000 steps per day. In a study employing the National Household Travel Survey data, Edwards (2008) reported that using public transport was associated with an average of 8.3 additional minutes of walking time per day, equivalent to expending 25.7-39.0 kcal/day. He estimated that obesity generated an annual \$34,200 in health costs per person and an

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additional 8.3 minutes additional walking is equivalent to saving \$4,800, \$5,500 and \$6,600 per person depending on the intensity of walk as well as considerable savings in quality adjusted life years. Li et al. (2008) expressed the density of public transit stations as the number of bus and transit stations divided by the area of census block group in square kilometers. They observed that the density of the transit stations was significantly associated with both walking for transport as well as meeting the physical activity recommendations. Brown and Werner (2008) studied the ridership behaviour among 51 residents of a traditional, mixeduse neighborhood of Salt Lake City, Utah after being invigorated with the newly laid TRAX light rail network. They classified their subjects in to three categories: non-riders; new riders who reported undertaking recent rail rides only after the stop opened; and continuing riders who reported recent rail rides both before and after the new stop opened. They reported that the prevalence of obesity was comparatively higher among non-riders (65%) in reference to new riders (26%) and continuing riders (15%). In a separate study, Brown et al. (2009a) measured the proximity to bus stops and rails stop and reported that being farther away from rail stop was significantly associated with higher BMI and increased risk of obesity, albeit only among females.

Cycling as a mode of active travel has also been reported to be making significant contributions to health promoting physical activity (Oja et al., 1998). Within Europe, Denmark, the Netherlands and Belgium have emerged as the top three countries for cycling rates (<u>http://dataservice.eea.europa.eu</u>). Regional level comparisons indicate that over the years, European cities have emerged as more walkable and cycle friendly, promoting higher levels of walking and cycling compared to those in Australia and countries in North America. In a regional study employing national surveys of travel behaviour and health indicators in Europe, North America, and Australia, Bassett Jr. et al. (2008) reported that the

residents of Europe walked more than their counterparts in the United States (382 versus 140 km per person per year) as well as bicycled more (188 versus 40 km per person per year) for the year 2000. Countries with the highest levels of active transportation reported lowest prevalence of obesity. Purcher et al. (2010) studied cross-sectional health and travel data across 14 countries and reported statistically significant relationships between walking, cycling, and health (in terms of lower prevalence of obesity) at the country, state, and city levels. Data from Denmark indicated that a 20% increase in cycling levels in the 5-year period between1996-2002 has been associated with a corresponding 5-month increment in life expectancy in the case of males.

To summarize, in the majority of the studies, the presence of public transit facilities within a walkable range has been found to reduce reliance on cars and enhance physical activity. It has been reported that the presence of a nearby bus stop/ light rail stop enhances the propensity to walk to them en-route to the final destinations, thereby reducing the odds of obesity.

### 4.3.6 Factor N6: Pedestrian oriented design

Design features of the streets and building structures adjacent to them such as the nature of sidewalks, presence of traffic calming features and safety provision, speed impediments as well as aesthetic aspects all influence the walkability of a neighbourhood. Road design features which encourage pedestrian walking include side walk coverage measured by the proportion of block faces with sidewalks, ratio of side walk length to road length, side walk width, average street width, number of pedestrian crossings and so on. Other features include clearer traffic signs, the presence of buffer zones between busy routes and footways, enclosed bus shelter with seats, frequently located public benches, and clearly marked slope changes with hand rails. Building setback is another important

parameter supporting pedestrian movement. Road safety provisions include limits on traffic speed and volume and traffic calming provisions. Achieving optimum traffic speed-limits reduces the risk of accidents and this may be achieved by advocating for appropriate impediments through narrow road width, tighter bends, reduced sightlines, presence of junction platforms and rough surfaces, adding traffic circles/roundabouts and installing pavement treatments. Several studies on physical activity behaviour have employed measures of presence of pedestrian infrastructures and degree of road safety (Giles-Corti et al., 2003, Saelens et al., 2003a, Hoehner et al., 2005, Li et al., 2005b, Cerin et al., 2007b, Nagel et al., 2008, Forsyth et al., 2008, Boehmer et al., 2007, Santana et al., 2009, Gómez et al., 2010, Yan et al., 2010). Giles-Corti et al. (2003) reported a significant association between absence of sidewalks as well as perception of no-sidewalks with the outcomes of overweight and obesity. Ewing et al. (2004) reported that roads with sidewalks along them as well as sidewalk coverage were significantly associated with higher walk propensity. Duncan and Mummery (2005) reported a negative association between walking for recreation and not having a footpath network within a 400 metre buffer. At the same time, a good perception of foot path condition was beneficially associated with recreational walking. Boehmer et al. (2007) had established a positive association between obesity with the perceived and objective measures of sidewalk quality. In their study, Forsyth et al. (2008) had reported a significant positive association between sidewalk length per unit area and travel walking. Nagel et al. (2008) reported that the presence of greater proportion of high volume streets was beneficially associated with minutes walked per week, while a greater proportion of low volume streets was negatively associated. Another study reported a beneficial association between walking for at least 60 minutes and self perceived feeling of safety from traffic (Gómez et al., 2010).

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Designing cycling networks with a modest degree of safety, comfort and route convenience encourages cycling and thereby results in increased levels of physical activity of residents. In the UK, the average cycling trip is 3 Km with a cut-off limit at 5 Km beyond which there is a sharp reduction in propensity to cycle. Several studies have considered the presence of cycling infrastructures (presence of cycling paths) and its potential impacts on travel behaviour (Giles-Corti et al., 2003, Saelens et al., 2003a, Ewing et al., 2004, Hoehner et al., 2005). Owen et al. (2010) had reported a positive association between bicycle use and degree of neighbourhood walkability for the cities of Ghent and Adelaide.

Aesthetics factors in the form of increased number of street trees, squares, pocket parks, broader pavements along retail and bus stops provide a pleasant pedestrian walking and cycling environment. On the contrary, presence of signs of physical decline and incivilities in the form of presence of littering, garbage, vandalism and graffiti may have a negative influence on walkability and psychological health. Besides, such environments have generally been related with higher prevalence rates of crime as well as fear of it and hence, a reduced sense of security (Perkins et al., 1992, Perkins et al., 1993, Cohen et al., 2000). A number of studies have employed various indicators of neighbourhood aesthetics (Saelens et al., 2003a, Duncan and Mummery, 2005, Ellaway et al., 2005, Hoehner et al., 2005, Van Lenthe et al., 2005, Stafford et al., 2007b, Leslie and Cerin, 2008, Boehmer et al., 2007, Mujahid et al., 2008b). Balfour and Kaplan (2002) considered six urban neighbourhood problems, namely crime; lighting at night; traffic; excessive noise; trash and litter; and access to public transportation and reported that older adults residing in multiple problem neighbourhoods were associated with higher odds of functional loss. Duncan and Mummery (2005) employed a perceived measure of neighbourhood cleanliness and reported a beneficial association between clean neighbourhoods and physical activity. In

another study, Ellaway et al. (2005) considered the amount of graffiti, litter, and dog mess in the immediate residential environment and reported a negative association between the levels of incivilities and physical activity, while, the associations were positive for being overweight/ obese. van Lenthe et al. (2005) reported negative associations between perceived measures of general neighbourhood design and noise pollution from traffic. Boehmer et al. (2007) reported that being obese was significantly associated with perceptions of an unpleasant community as well as observed indicators of physical disorder and presence of garbage. Stafford et al. (2007b) considered the number of special constables, police officers, presence of vacant/ derelict land, violent crime rate as well as the number of missed waste collections as the indicator of neighbourhood disorder and reported the first three to be significant. In their path model neighbourhood disorder was significantly association of sports participation rate. Leslie and Cerin (2008) reported a positive association between their perceived measure of aesthetics and greenery and the neighbourhood satisfaction domains of safety and walkability, access to destinations, social network and travel network.

Several studies have considered perceived indicators of neighbourhood crime (Saelens et al., 2003a, Burdette and Whitaker, 2004, Duncan and Mummery, 2005, Hoehner et al., 2005, Mobley et al., 2006, Black et al., 2010, Wood et al., 2010, Yan et al., 2010). Van Lenthe et al. (2005) had reported a negative association between sports participation and neighbourhoods requiring police attention. Santana et al. (2009) established a positive association between BMI and crimes against property. In another study Guite et al. (2006) reported that the feeling of unsafe environment during the day time was negatively associated with mental health and vitality.
Visual outlook and complexity is another factor which influences the environmental psychology of a place. Ewing et al. (2006, 2009) hypothesized that the qualitative urban design qualities of street environments define the individual perceptions of streetscapes thereby influencing their willingness to walk and be active in them. Their study considered nine perceptual qualities of built environment including imageability, complexity, visual enclosure, human scale, transparency, linkage, legibility, coherence and tidiness and developed operational definitions and objective measurement protocols for the former five.

In a nutshell evidence suggests that a neighbourhood with pedestrian friendly design; those accompanied with pedestrian and cycling infrastructures, a better perception of aesthetics and safety from traffic and crime promotes physical activity with potential benefits to physical and mental health.

## 4.4 Factor N7: Composite measures of walkability and environmental quality

One of the problems associated with assessing the nature of relationship of a health outcome with a set of individual built environmental variables is that the built environmental variables often come as a parcel of highly correlated measures which often leads to multi-collinearity problems, resulting in inaccurate model estimation. It may be that because of interaction effects therefore, the core dimensions of the built environment cannot be captured by any single individual variable. Several studies have conducted research on various composite neighbourhood level indicators of active living (Craig et al., 2002, Ramirez et al., 2006). A group of studies have resulted in the development of indices of walkability which are composites of multiple variables of density, diversity, design and route. Such compact indices reflect the interrelatedness of the individual level built environmental variables more effectively and have often been

employed as a planning and policy tool. At the same time, a major criticism associated with such an approach is that we are able to get the overall picture, but at the cost of a loss of resolution and loss of purchase in terms of designing interventions: the impact of specific neighbourhood attributes upon health cannot be ascertained *per se* in this method.

A number of studies have reported the development of composite walkability index. Cervero and Duncan (2003) employed factor analysis to create a reduced form of residents-to-retail/services balance index, employed residents-to-job balance index, mixed used entropy, average m<sup>2</sup> per block within 1 mile; proportion of 3-way, 4-way, 5 or more intersections; and dead-end proportions within 1 mile of origins and destinations to four factors - pedestrian/ bicycle friendliness of origins/destination land use diversity of origins/ destination. The study reported that land use diversity at origin was beneficially associated with walking. Saelens et al. (2003a) developed a survey tool called the Neighbourhood Environment Walkability Scale (NEWS) to assess the key built environment characteristics theorized to be associated with physical activity. It was based upon built environment measures of residential density, proximity to and ease of access to non-residential destinations (expressed as land use mixdiversity and land use mix-access), street connectivity, walking/cycling facilities, aesthetics, traffic safety, crime safety. Residential density was expressed in terms of the frequency of various types of neighbourhood residences and was weighted relative to the average density of single family detached residences. Mix was evaluated in terms of walk-proximity from home to various types of services. The responses ranged from 1-5 minutes walking distance (coded as 5) to  $\geq$  30 minutes walking distance (coded as 1). A Likert-type scale was employed to put the responses in one of the four categories ranging from strongly disagree up to strongly agree with higher scores indicating a more favourable value of the built environment characteristics. Subsequently, an Australian version of this instrument has been developed (Cerin et al., 2008). Frank et al. (2006) conducted the Neighbourhood Quality of Life Study (NQLS) in King County and Seattle, Washington and in the Baltimore – Washington DC region, to assess the nature of relationship between the urban form and physical activity and obesity. They developed a Walkability Index which reflected the composite measure of built environment design expressed as the sum of the z scores of residential density, intersection density, land use mix and retail floor area ratio. An Australian study modelled on the NQLS study was conducted by Leslie et al. (2007) at the level of Australian Bureau of Statistics Census Collection District (CCD). 156 CCDs representing households from 32 communities were included in the study. The walkability index had four similar components – dwelling density, intersection density, land use entropy and net retail area. A 1-10 score was employed for each of the components which were summed to produce walkability scores ranging from 4-40. The walkability index scores for each of the CCDs were classified into quartiles; the first quartile representing low walkability CCDs and the fourth quartile high walkability CCDs. Another large scale European study, equivalent of the NQLS and PLACE was the Belgian Environmental Physical Activity Study (BEPAS) conducted by Van Dyck et al. (2010) in 24 neighbourhoods from 201 statistical sectors of Ghent. The study aimed to examine the nature of association between neighbourhood walkability, SES and physical activity among Belgian adults. The neighbourhood walkability index developed comprised three components of objectively measured residential density, intersection density and land use mix which were normalized and converted to Z-scores. Walkability was expressed as -

*Walkability* = (2\*z-connectivity) + (z-residential density) + (z-land use mix)

The impact of urban sprawl on physical activity and weight outcomes has been an active area of research. In another study, Doyle et al. (2006) developed a composite measure of walkability which was the summation of the z-scores of the negative average block size, the percent of all blocks having areas of less than 0.01 square miles and the number of 3-, 4-, and 5-way intersections divided by the total number of road miles. They reported a higher propensity to walk and improved weight outcomes in respondents residing in counties that were more walkable and had lower crime rates in reference to those that were less walkable and more crime-prone. Under the Walkable and Bikable Communities Project, data on approximately 200 directly observable neighbourhood attributes within 1km and 3-km circular buffers were captured and measured distance to destinations up to 3 km from a respondent's home were enumerated. Of the Euclidean and network buffer models developed, eight of the built environment variables were found to have a significant association with walkability in the Euclidean buffer model. They included shorter distance to closest grocery store; more dwelling units per acre; more grocery stores, restaurants, or higher retail density; fewer educational parcels; fewer grocery stores or markets within 1-km buffer; smaller size of closest office complex; longer distance to closest office/mixed-use complex and smaller size of block where residence is located. They were combined to compute composite walkability scores within 100, 500 and 1000 metres buffers (Berke et al., 2007b, Lee and Moudon, 2006a). High walkable scores were reported to be beneficially associated with walking for exercise but not with weight outcomes (Berke et al., 2007b). In another study Berke et al. (2007a) reported the walkability scores at 100, 500 and 1000 metres were associated with lower odds of depression among men, but not among women.

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Several studies have reported beneficial associations between mental health and improvements in built environment (Halpern, 1995, Delgard and Tambs, 1997). In recent years, several studies have investigated the role of composite micro-level local neighbourhood environmental quality and design clearly in determining individual behaviour as well as psychological health. These studies are mostly based on detailed environmental audits and surveys conducted by trained individual's reporting both the objective measures as well as subjective perceptions of the built environment.

Weich et al. (2001, 2002) reported the 27-item observer-rated instrument called the Built Environment Site Survey Checklist (BESSC) that was developed to assess the built environment across eleven housing areas in two electoral wards of North London. The component items included questions with respect to the predominant characteristics of buildings, audit of the immediate space around the buildings, neighbourhood facilities and accessibility as well as perception of safety and security. The instrument was employed as a psychometric tool to study the association between environmental quality and depression and reported a higher odds of depression in properties characterized by predominantly deck access and those recently (post-1969) constructed. Dunstan et al. (2005) reported the development of the survey instrument known as Residential Environment Assessment Tool (REAT), used to assess the contextual physical aspects as well as the extent to which residents establish territoriality over their neighbourhood. The composite REAT index comprised 28 items measured at the post code level in the Neat Port Talbot borough of South Wales. Each item was scored between 0-1 and subsequently multiplied by an assigned integer weight ranging between1-3. It comprised component subindices for physical incivilities, territorial functioning, defensible space, natural environment and a miscellaneous component. It relies on the subjective

evaluation of surveyors. Thomas et al. (2007) employed REAT as a psychometric tool to study the contextual variations of mental health but found no significant association between REAT measures and psychological health. Araya et al. (2007) developed a similar instrument called the Built Environment Assessment Tool (BEAT) for the city of Santiago, Chile. It comprised 25 items across four factor analysis derived components representing general quality of the area; facilities, noise and traffic in the area; public green areas; and empty sites. Their study reported a significant association between the quality of the built environment and prevalence of common mental disorders. Brown et al. (2009b) employed the University of Miami Built Environment Coding System (UMBECS) to assess 3857 lots of East Little Havana, Florida. They considered seven building level indicators representing the eye on the street including above grade front entrance, stoop, porch, ground floor parking, window area, window-sill height and building setback. The study reported that architectural features of the front entrance that promote visibility of the building's exterior were beneficially associated with perceived social support, while those promoting visibility from the building's interior were negatively associated. Structural equation path models indicated a positive association between perceived social support and reduced psychological distress among the elderly.

## 4.5 What next? - The need to move from the neighbourhood level to the city level

To conclude this detailed and extensive review I present a summary of the various categories of built environment variables studied in Table 3.3, with the finer details of the studies and key findings summarized in Table 3.4. Table 3.5 summarized the survey instruments employed thus far in built environment - health studies for identifying composite quality and design attributes. A scan of these tables reveals number of consistent findings but also shows that the

magnitude, direction and significance of associations between neighbourhoodlevel built environment factors and health outcomes are mixed for some dimensions/variables. As well as possibly reflecting unmeasured effects, this may be attributed to the general lack of uniformity in built environment - health studies. Methodological issues arising are summarized below:

- There is no standard set of rules for the selection of built environment and confounding variables in models. Different studies have employed different criteria.
- There is no standard definition of 'neighbourhood' in BE-health studies. Most
  of the studies have employed census defined boundaries as proxy
  neighbourhood. More accurate definitions, for example defined by a buffer
  around a subject's home have been employed. However, operationalization
  of functional neighbourhood for s subject in neighbourhood studies is still a
  challenge on account of individual-level variabilities.
- The contextual built environment factors are often unique and local to a particular neighbourhood and city being studied. Thus two cities may have different land use and street configurations and socio-economic dynamics. Even within the same city two neighbourhoods may have contrasting dynamics, for example the dynamics of the city centre may be quite different from the peripheral suburbs. This problem can be overcome to some extent through larger studies where the effects of local specificities may be expected to be captured in normally distributed error terms in the models.
- Most importantly, the compositional and socio-demographic characteristics of the individuals and population being studied may be quite varied. In other words, the association between a particular contextual built environment factor and health outcome may differ according to the age, gender, socio-

demographics and well as lifestyle factors. Again, this is something that can best be addressed through larger-scale studies.

Other methodological questions pertain to the robustness and reliability of the strength and significance of associations measured. Most of the studies have a cross-sectional design. Longitudinal studies conducted over a period of time are scarce, primarily on account of the lack of prospective data on health outcomes as well as on built environment attributes. Consequently, the question about the impacts of sustained exposure to changes in the built environment still remains to be answered with any degree of certainty.

Similarly, designs that reliably indicate causality are scarce for the same reason. Natural and controlled experiments are difficult to design, especially given the large numbers needed to capture weak (but significant) associations. Again, large longitudinal studies are the way forward for drawing stronger causal conclusions.

As well as increasing numbers and adding temporal change data, another approach to overcome these limitations may be to move up to the next spatial hierarchy in my urban health niche model; focusing empirical studies of the city and regional level. There is a need to conduct within-city studies to compare the associations between built environment and health between clusters of homogeneous neighbourhoods. Studies with a similar design have been previously conducted (Saelens et al., 2003a, Handy et al., 2006, Cerin et al., 2007b). Within-city between-neighbourhood studies have the potential to identify the differences in health outcomes within the city as well as uncover specific cross-level interactions such as the impact of built environment on health may be different for different neighbourhood SES. Several between-cities regional-level studies have also been reported (Ellaway et al., 2005, Sallis et al., 2009a). Nonetheless, care should be taken so that the subject and cities chosen for such

studies have a certain degree of homogeneity. Such a design may have the potential to unearth certain regional level factors at work. Accompanying such models should be more perceptive behavioural theory that generates plausible explanations for the area-affects captured at different spatial scales. For example, at a city scale, differences between cities in a regional study may reflect differences in public transport consumption culture that may tend to develop separately in each city. These might, for example, give rise to minor but systematic differences between cities in the cost of time or perceived cost of distance, which without systematically capturing the 'city' effect' would confound just about all measures of accessibility used in the models.

Prospective, cohort or longitudinal studies have the potential to identify the citywide effects of changes in the built environment upon health. A few built environment - health studies have reported longitudinal models of health outcomes (Li et al., 2009a, Wolch et al., 2011). Nonetheless, there is an urgent need to compile retrospective spatial data on built environment, as such an approach may have a potential to identify the impacts of urban regeneration as well as retrofitting of the urban spatial structure of the city. The impact of exposures to differential within-city environments within a city can be further gathered from longitudinal studies of the impact of mobility on health. Several studies have looked in to the impact of moving from one neighbourhood environment to another (Delgard and Tambs, 1997, Wells and Yang, 2008, Lee et al., 2009). Longitudinal multilevel studies have the potential to further isolate the effects into neighbourhood level and individual level factors as well as, as I have noted, moving towards explaining causality (Diez Roux, 2004b). Casecontrol (retrospective) study designs (Schlesselman, 1982) conducted over a period of time have the potential to isolate the beneficial/detrimental effects of

specific built environment attributes upon the vulnerable individuals of the population.

Several US studies have tried to assess the impact of urban sprawl with the help of composite sprawl indices and have consistently reported detrimental effects (Ewing et al., 2003b, Lopez, 2004, Garden and Jalaludin, 2009, Lee et al., 2009). Nonetheless, with the increasing urban population another pertinent question that arises is economy of urban scale in health and health provision. Almost a generation ago, several authors had introduced the idea of external economies associated with *agglomeration* within a city system (Segal, 1976, Moomaw, 1981, Henderson, 1986, Henderson, 1988). At a population level we may wish to ask if there exists any such threshold for optimal city size; spatial economies of scale in population health outcomes.

As suggested in Figure 1.1 of Chapter 1, it is expected that increasing city size magnifies the agglomeration effects manifested in the form of enhanced economies in infrastructure, services, and accessibility, until we reach point P3 of the curve. Beyond P3, the benefits of agglomeration are offset by increasing externalities of pollution, congestion, informality and poverty along the periphery; and we can now add to the interpretation of that curve and that point, all or the alleged and evidenced health 'costs' documented in this review. Of course point P3 of the curve will be unique to each city and this is indicative of the necessity to conduct future studies focusing on relationships between urban spatial scale, the urban production function (cost of running cities of difference sizes including running their health care systems) and population health, with the objective of identifying the optimum size in terms of both area and population density and imposing policy constraints accordingly.

[CHAPTER: 4]

At an individual level, in addition to neighbourhood-level studies, the impact of the city as a whole should be taken into consideration as envisaged by my urban health niche model. For example a pertinent question in the public health context is: Do spatial network attributes at the levels of household, surrounding neighbourhood, city, as well as the overall region, have any impact upon an individual's health and how do we analytically capture them in order to study the nature of potential correlations? Spatial road networks are the arterial and venal systems of the city. They distribute the benefits of urban agglomeration to individuals and share out the costs. This relative apportionment can be measured using network models of accessibility as independent predictors in the kind of well-founded epidemiological models discussed in this chapter. Measuring detailed topology and geometry of an urban habitat's connectivity system at different spatial scales is likely to increase the power of models that attempt to find associations between attributes of built environment and health. This is the overriding hypothesis of this thesis.

To the present knowledge of the author, the work in the subsequent chapters (and the related work already published), is the only work to model the simultaneous analysis of the effects of multiple network attributes at different spatial scales upon individual health outcomes. I therefore offer the remaining parts of this thesis as a unique contribution to the body of knowledge reviewed in this chapter.

						Ra	inge of ne	ighbourh	ood built	environm	ent variab	les				
References	Density	Land use diversity/mix			Destir	nations			Stre	et networl transport system	k and	Pedestrian infrastructure	Cycling infrastructure	Crime	Aesthetics	Notes & Other measures (if any)
	(1)	(2)	3a	3b	3c	3d	3e	3f	4a	4b	4c	(5)	(6)	(7)	(8)	
Giles-Corti et al. (2003)					√*		√*		√*			√*	~			Note: The variables included both objective as well as perceived self-reported measures.
Cervero & Duncan (2003)									*							Others: Block density, residentialness index, residents-to-retail /services balance index, residents-to-job balance index. Note: All the variables were assessed within a neighbourhood both the trip origins and destinations.
Ewing et al. (2003b)	~	1							*							Note: Composite sprawl indices <sup>*</sup> were developed; metropolitan sprawl index (also considered degree of centrality) and county sprawl index (also considered block measures).
Saelens et al. (2003a)	<b>√</b> *	<b>√</b> *			~				√*	~		~	~	<b>√</b> *	<b>√</b> *	Note: These constituted the self reported Neighborhood Environment Walkability Scale (NEWS).
Burdette et al. (2004)							~	~						~		Note: No significant results.
Ewing et al. (2004)	✓ <sup>a</sup>	✓ <sup>b</sup>			~				~			✓*	~			a → residents + jobs density. b → Job-residence balance, job mix. Others: Accessibility indices.
Frank et al. (2004)	1	✓*							~							Others: Time spent in cars <sup>*</sup> , distance walked <sup>*</sup> .
Lopez (2004)	~															Urban Sprawl Index* based on population density.
Duncan & Mummery (2005)	<b>√</b> <sup>a</sup> ∗		✓*			√*			~			√*		~	√*	a → Number of active people in 1 km radius. Others: Also included number of registered dogs within buffer. Some of the measures were perceived self-reported.
Ellaway et al. (2005)															✓ <sup>a</sup> *	a → Objectively assessed scale based on amount of graffiti, litter, and dog mess, as well as the level of vegetation and greenery visible on the dwelling and streets immediately surrounding it.
Hoehner et al. (2005)	✓ <sup>a</sup>		~	~			✓*			~	√*	<b>√</b> *	✓*	~	✓*	a → Number of non-residential/specific purpose destinations.

## Table 4.3. Summary of the neighbourhood-level built environment variables employed in assessing health outcomes.

															Note: The variables included both objective as well as perceived self-reported measures.
King et al. (2005)	✓ <sup>a</sup>		~	∕*		<b>√</b> *	~								a → Housing characteristics of participants' neighborhoods (measured as % of residents
															living in poverty*, with less than a bachelor's degree, nonwhite and unemployed; median household income; urbanicity; and median
															year that homes were built*).
Li et al (2005b)	<b>√</b> <sup>a</sup> *		✓*	~			<b>√</b> *		√*	~		✓	√*		a → Number of households, places of employment. Note: Some of the measures were perceived self-reported.
Rutt & Coleman (2005)	✓ <sup>a</sup> *		*	*					1			*			a → Population density, density of non- residential buildings Others: Slope, overall health*, SES*, number and type of morbidities*, television time, fruit and vegetable consumption*, perceived barriers to physical activity*. Note: Some of the measures were perceived self-reported.
van Lenthe et al. (2005)			~	√*			~	√*					√*	√ <sup>a</sup> *	a → Noise pollution. Note: Based on self reported scores of general attractiveness of neighbourhoods, proximity to neighbourhood facilities and crime.
Gordon- Larsen et al. (2006)			✓ <sup>a</sup>	✓ <sup>a</sup>		✓ <sup>a</sup>	✓ <sup>a</sup>								a → Number of physical activity facilities per census blocks*.
Inagami et al. (2006)								√ <sup>a</sup> *							a → Access to grocery stores, disadvantage score difference between grocery store neighbourhood and residential neighbourhood. Others: neighbourhood SES.
Lee & Moudon (2006)	<b>√</b> <sup>a</sup> *		~	*	*	~		*		~	1	✓*		~	a → Net and parcel level residential density. Others: block size, slope*. Note: Some of the measures were perceived self-reported.
Mobley et al. (2006)		√*		<b>√</b> <sup>a</sup> *				✓ <sup>a</sup>					<b>√</b> *		a → Number of fitness facilities, full-sized grocery stores, fast food establishments, restaurants, and minimarts per 1000 residents. Others: Neighbourhood affluence*.
Morland et al. (2006)								√*							
Nelson et al. (2006)				~					✓ <sup>a</sup>						a $\rightarrow$ 3-way and 4-way intersection density, $\alpha$ -index, $\gamma$ -index, and cyclomatic index within

		1											1		1	1 ((
																buffer. Others: Also included road type. Note: The study compared self reported physical activity in six neighbourhood clusters.
Norman et al. (2006)	✓ <sup>a</sup>	~	√*		<b>√</b> <sup>b</sup> *		√*		√*							a → Residential density. a → Retail floor area ratio. Other: Index of neighborhood walkability.
Berke et al. (2007b)	√ <sup>a</sup> *				~			√*								a → Dwelling units per acre. Others: block size*, size of office closest complex*, number of educational parcels*. Note: The variables were employed to construct the neighbourhood walkability score.
Boehmer et al. (2007)	√ <sup>a</sup> *						1			~	~	<b>√</b> *				a → In terms of presence of non-residential destinations. Note: The variables included both objective as well as perceived self-reported measures.
Boer et al. (2007)	✓ <sup>a</sup>	✓ <sup>b</sup> *							<b>√</b> *							a → Housing density. b → Business diversity score; number of different types of businesses in a neighborhood. Others: block length, parking pressure.
Cerin et al. (2007b)	√ <sup>a</sup>	1			~	*			*	~		✓		*	1	a → Residential density. Note: These constituted the self reported Chinese version of Neighborhood Environment Walkability Scale (NEWS) *.
Cerin et al. (2007a)	✓ <sup>a</sup> *	1	*		<b>√</b> *	*	*	*								a → Objective profile of LUM, based on clustering of neighbourhoods with similar proportion of land uses. Perceived proximity* to non-residential destinations were based on the sub-scale of Neighbourhood Environment Walkability scale.
Diez Roux et al. (2007)			~	√*			~									
Jilcott et al. (2007)			✓ <sup>a</sup>	✓ <sup>a</sup> *			✓ <sup>a</sup>									a → Proximity to physical activity resource. Note: The variables included both objective as well as perceived self-reported measures.
Rundle et al. (2007)	<b>√</b> <sup>a</sup> *	√*							~		✓ <sup>b</sup> *					a → Population density. b → Bus stops/km <sup>2</sup> , subway stops/km <sup>2</sup> .
Stafford et al. (2007b)	<b>√</b> <sup>a</sup> *			~		~	<b>√</b> *	~						✓*	<b>√</b> *	a → Population density. Others: Policing levels, perceived social disorders and participation in physical

																activity.
Tilt et al. (2007)			~			~	~	~								Others: NDVI index of greenness, self reported destinations, natural features, satisfaction with greenness, and perceived importance of destinations. Note: composite measures of objective and subjective accessibility and greenness were significant.
Forsyth et al. (2008)	~	1	~	~	~	1	~	√ <sup>a</sup> ∗	√*		~	✓*			1	a → Density of food store employees. Others: Also included perceived environmental measure.
Leslie & Cerin (2008)	~	✓*	~			√*			√*	√*		✓*	~		√*	Note: These constituted the Australian version of self reported Neighborhood Environment Walkability Scale (NEWS).
Li et al. (2008)		<b>√</b> *	<b>√</b> *					<b>√</b> *	<b>√</b> *		√*					
Mujahid et al. (2008b)								~						1	~	Note: In addition measures of walking environment, safety and social cohesion were used to construct two self reported indices of neighbourhood physical environment <sup>*</sup> and neighbourhood social environment <sup>*</sup> .
Nagel et al. (2008)			~		<b>√</b> *				~	~	✓ <sup>a</sup>	~				a $\rightarrow$ Calculated as number of bus lines. Others: Street volume <sup>*</sup> .
Smith et al. (2008)	✓ <sup>a</sup>								<b>√</b> *							a → Population density in block group. Others: Housing age*, proportion walking to work*.
Wells & Yang (2008)	✓ <sup>a</sup>	✓ <sup>b</sup> *							<b>√</b> *			*				a → Population density, employment density, housing density, service job density. b → Service-jobs/population ratio, job/resident ratio. Others: Design features of the lot and building.
Brown et al. (2009a)	<b>√</b> <sup>a</sup> ∗	✓ <sup>b</sup>	~						√*		√*					a → Areas under six land uses. b → 6-, 3-, and 2-category land use mix. Others: Proportion of residents who walk to work, tract housing age*.
Dengel et al. (2009)	✓ <sup>a</sup>	√ <sup>b</sup>		1			1	√*	1							a → Residential density. b → employment density, percent land use under residential, parks and recreation, vacant. Others: Distance to schools.
Garden & Jalaludin (2009)	√ <sup>a</sup>															a → Population density based sprawl index*. Others: 2001 Index of Relative Socio- Economic Disadvantage.

Lee et al. (2009)	✓ <sup>a</sup>														a → Sprawl index* based on population density and block size.
Pan et al. (2009)				~			~			~		1	1		Others: Social support. Note: The measures were perceived self- reported. The overall index of facility availability remained significant predictor of physical activity.
Sallis et al. (2009a)	✓ <sup>a</sup>	1			✓ <sup>b</sup> *				~						a → Net residential density. b → Retail FAR. Note: These constituted the census block level walkability index.
Santana et al. (2009)			~	~		✓ <sup>a</sup> *	~	~		✓ <sup>b</sup>				✓*	a → Including public health services b → Traffic accidents. Others: Household inadequacy, neighbourhood deprivation.
Black et al. (2010)	<b>√</b> <sup>a</sup> *			✓*				<b>√</b> *						*	a → Percent of residential and commercial land use. Others: Composite index of neighbourhood amenities* and neighbourhood vulnerability.
Gomez et al. (2010)		~	√*				<b>√</b> *		∕*	<b>√</b> *	~	1			Note: The measures were both objective as well as perceived self-reported.
Owen et al. (2010)	√ <sup>a</sup>	4			√b				*						a → Dwelling density. b → Net retail area ratio. Note: These constituted the composite walkability index <sup>*</sup> . A Dutch version of the Neighbourhood Environment Walkability Scale instrument was also employed.
Pouliou & Elliott (2010b)	✓ <sup>a</sup> *	<b>√</b> *					~	~	<b>√</b> *						a → Residential density. Others: Composite walkability index*.
Troped et al. (2010)	<b>√</b> <sup>a</sup> *	√*							√*						a → Residential population density and housing unit density. Others: Greenness measured by NDVI*.
Wood et al. (2010)	√ <sup>a</sup>	✓*			✓ <sup>b</sup> *	~			1	1		*		*	a → Net residential density. b → Commercial FAR. Others: Presence of steep hills,* and interesting sites*. Note: The variables included both objective as well as perceived self-reported measures.
Yan et al. (2010)	✓ <sup>a</sup>	√ <sup>b</sup>			*				*	√*	<b>√</b> <sup>C</sup>	✓*		*	<ul> <li>a → tract population density, density of housing units, 3D population density.</li> <li>b → diversity index, HHI, acreage of commercial area.</li> <li>c → Residential and commercial transit.</li> <li>Others: Access to CBD.</li> </ul>

Burgoine et al. (2011)	<b>√</b> <sup>a</sup> ∗	~					~	~				a $\rightarrow$ Residential density.
Saarloos et al. (2011)	✓ <sup>a</sup>	*		✓ <sup>b</sup> *	✓ <sup>b</sup>	✓ <sup>b</sup>		*				a → Residential density. b → Presence/absence of retail, community services, business and offices. Others: Composite walkability index.

1: Density (residential/population) 2: Land use mix; 3a: Public spaces and open spaces; 3b: Sports and physical activity facilities; 3c: Retail/commercial establishments; 3d: Services; 3e: Recreational Facilities; 3f: Food environments; 4a: Connectivity characteristics of streets; 4b: Traffic safety (speed/volume); 4c: Access to public transit stops and stations; 5: Pedestrian infrastructure; 6: Cycling infrastructure; 7: Crime; 8: Aesthetics.

\*  $\rightarrow$  Significant association.

Reference	Sample size/ Geographical Extent	Outcome variables	Neighbourhood Definition	Key neighbourhood environmental variables	Key socio- economic and demographic variables	Model Type	Significance results
Balfour and Kaplan (2002)	A 1-year follow-up study of 883 older adults who participated in the 1994 and 1995 waves of the Almeida County Study in Almeida County, California.	Functional loss (a nine item score comprising of pushing a large object, lifting a weight of more than 10 pounds, reaching the arms up above the shoulders, writing or handling small objects, stooping or crouching, getting up from a stoop, standing in place for more than 15 minutes, walking a quarter mile, and walking up a flight of stairs).	Census tract.	Rating the seriousness of six potential neighbourhood problems associated with urban living (crime, lighting at night, traffic, excessive noise, trash and litter, and access to public transportation).	Age, sex, family income, household size, educational level, race/ethnicity, social connectivity (marital status, membership in social, political, and community groups and degree of social isolation), health (self rated health, levels of depressive symptoms, count of chronic condition), smoking, alcohol consumption, body mass index and scale of physical exercise.	Logistic regression using Generalized Estimating Equations.	In reference to individuals living in no- problem neighbourhoods, those who resided in multiple-problem neighbourhoods reported higher odds of overall functional loss (OR=2.23, 95% CI: 1.08, 4.60) and lower extremity functional loss (OR=3.12, 95% CI: 1.15, 8.51). Neighbourhood problems identified to be associated with the largest increase in risk were excessive noise, inadequate lighting, and heavy traffic.
Takano et al. (2002)	A cohort of 3144 older adults born in 1903, 1908, 1913,or 1918 in two cities of Tokyo Metropolitan area and followed up between 1992- 1997.	Five year survival of older adults.		Residential environment questionnaires with components of: presence of space for taking stroll near residence, parks, noise from automobiles and factories, levels of crime, hours of sun light, existence of gardens, whether residence faced a road with regular bus service, active communication among neighbours, preference to continue to live in the current community.	Age, sex, marital status and living expenses.	Chi square, Kruskal- Wallis test, principal component analysis and logistic regression.	Probability of five year survival was beneficially associated with presence of space for taking stroll near residence ( $p$ <0.01), presence of parks and tree lined streets ( $p$ <0.05) and preference to continue to live in the current community ( $p$ <0.01). Principal component analysis identified two factors. After controlling for individual level variables, the five year survival was significantly associated with the factor of walkable green streets and spaces near residence (OR=1.13, 95%CI: 1.03, 1.24).
Weich et al. (2002)	A cross sectional sample of 1887 individuals in two electoral wards of North London.	Depression measured by the Centre for Epidemiologic Studies Depression scale (CES-D).	Housing areas (areas with homogeneity in housing form).	31-item Built Environment Site Survey Checklist (BESSC) with items of predominant form, height and age of housing, number of dwellings and type of access, provision of gardens, use of public space, amount of derelict land, security, and distances to local shops and amenities.	Age, gender, ethnicity, marital status, employment status, educational qualification, access to cars or vans and dwelling level factors (tenure, floor level, presence of structural problems of dampness, leaking roof, rot in wood, infestation, and length of stay in current dwelling).	Logistic regression. Sensitivity analysis through OLS regression.	Prevalence of depression was significantly associated with living in housing areas characterized by properties with predominantly deck access (OR=1.28, 95% CI: 1.03, 1.58) and recent / post-1969 construction (OR=1.43, 95% CI: 1.06, 1.91).

 Table 4.4. Summary of research evidence from the studies of the association between the neighbourhood-level built environment variables and health outcomes.

de Vries et a (2003)	I. Cross sectional sample of 10197 respondents from 1155 neighbourhoods who participated in the Dutch National Survey of Morbidity and Interventions in General Practice.	Self-reported health indicators (% of symptoms experienced in the last 14 days, perceived general health, Dutch version of GHQ score).	Netherlands was divided up into about 10 000 neighbourhoods (average 1500 inhabitants) The environment of a neighbourhood was defined as a circle with a radius of 3 km around the centre of the neighbourhood.	% of green space (urban green, agricultural green, forests and nature areas); % of blue' space (fresh and salt water surface); presence of a garden (from survey); urbanity (based on a 5 point score).	Gender, age, no. of life events in the past year, level of education, household income, no. of rooms in house, type of health insurance.	Linear multiple regression (multilevel).	The percentage of green and blue space as well as the presence of garden was positively associated with improved health outcomes expressed in terms of percentage of symptoms, perceived general health and GHQ. The relationship of green space and all the three health indicators was stronger for lower educated people, while with number of self reported symptoms, the relationship tended to be stronger for housewives and elderly.
Giles-Corti al. (2003)	A cross sectional survey of 1803 healthy sedentary adults, aged 18-59 years who participated in the Study of Environmental and Individual Determinants (SEID1) in Metropolitan Perth, Western Australia.	BMI based on self reported height and weight.	-	3-objectively measured variables: Type of street in which the respondent lived (cul-de-sac, highway, or other), presence of sidewalks (none or on one or both sides of road), spatial access to four or more recreational facilities. 2-perception measures: Presence of walking or cycle paths within walking distance or a 5-minute drive, presence of a shop within walking distance.	Demographic factors (age, sex, education, occupation, SES of area of residence) Lifestyle factors (hours per week spent watching television, recreational physical activity, access to a motor vehicle) Social environmental factors (degree of physical activity).	Logistic regression	Fully adjusted model reported that overweight was significantly associated with living on a highway (OR= 4.24; 95% CI: 1.62, 11.09), streets with no sidewalks or sidewaks on one side only (OR=1.35; 95% CI: 1.03, 1.78) and perceiving no paths within walking distance (OR=1.42; 95% CI: 1.08, 1.86). Obesity was associated with poor access to four or more recreational facilities (OR=1.68; 95% CI: 1.11, 2.55) and sidewalks (OR=1.62; 95% CI: 0.98, 2.68) and perceiving no shop within walking distance (OR=1.84; 95% CI: 1.01, 3.36).
Cervero an Duncan (200	d Cross sectional sample of 7889 randomly selected households in the 9-county San Francisco Bay Area who participated in the Bay Area Travel Survey (BATS).	Non-motorized travel (Walking and cycling).	1-mile radii of trip origins and destinations.	Factor analysis identified four factors: Pedestrian - bicycle friendliness of origins/destination, land use diversity of origins/destination. The following variables were included: Average sq m/block within 1 mile of origin/destination, proportion of 3-way, 4- way, 5 or more intersections within 1 mile of origin/destination, proportion of dead end proportions within 1 mile of origins/ destinations, mixed used entropy within 1 mile of origin/destination, residents-to- retail/services balance index and residents-to-job balance index within 1 mile buffer of origin/destinations.	Gender, race/ethnicity, disability, number of vehicles in household, neighbourhood income. Constraints to walking/cycling: trip distance, slope, rainfall on day of trip, trips made during nightfall.	Discrete choice logit modeling.	The only built-environment factor reported to be significant to walking was land-use diversity at the trip origin (g=0.098, p=0.021). In the case of cycling choice model, the urban design and land-use diversity factors were positively associated but not significant at 5% probability level.
Ewing et a (2003b)	Cross sectional sample of 206,992 adults of 448 US counties and 175,609 adults from 83 US metropolitan areas who participated in the Behavioral Risk Factor Surveillance System (BRFSS) study.	Health behaviour and health status: Any physical activity, recommended physical activity, minutes walked), BMI, Obesity and morbidity (hypertension, diabetes, and coronary heart disease).	County and Metropolitan levels	Metropolitan sprawl index (residential density, land use mix, degree of centering, street accessibility) County sprawl index (gross population Density, % of population living at densities 1500 persons/sq mile, % of population living at densities 1,500 persons/sq mile, County population/ amount of urban land in sq mile, Average block size, % of blocks 1/100 of a sg mile or less).	Age, gender, race/ethnicity, education, smoking, diet.	Hierarchical linear and non-linear modelling.	Fully controlled models indicated that the residents of sprawling counties were likely to spend lesser minutes walking ( $\beta$ =0.275, p=0.004). Also the residents of sprawling counties were likely to have higher BMI ( $\beta$ =-0.0034, p=0.005), be more obese ( $\beta$ =-0.0021, p<-0.01) and have higher risks of hypertension ( $\beta$ =-0.0011, p=-0.018). At a metropolitan level sprawl was

							reported to be negatively associated with minutes walked as a leisure time activity (β=0.338, p= 0.040).
Saelens et al. (2003a)	Cross sectional samples of 54 residents from a high walkability neighbourhood and 53 residents from low walkability neighbourhood, aged 18-65 years from San Diego, California.	Physical activity (measured by accelerometer), Self-reported walking, as well as Leisure time physical activity (assessed with the Godin–Shephard Leisure Time Exercise Questionnaire).		Neighborhood Environment Walkability Scale (NEWS): Self reported survey of Residential density (frequency of various types of neighbourhood residences); (land use mix–diversity (walking proximity from home to various types of stores and facilities between 1-5 minutes and ≥ 30 minutes); land use mix–access; street connectivity; walking/cycling facilities, such as sidewalks and pedestrian/ bike trails; aesthetics; pedestrian/ traffic safety; and crime safety (Test-retest reliability = 0.58-0.80).	Age, gender, ethnicity, education status.	ANOVA/ANCOVA Logistic regression.	Residents of high-walkability neighborhoods reported higher residential density, land use mix, street connectivity, aesthetics, and safety and had more than 70 more minutes of physical activity and had lower obesity prevalence (adjusted for individual demographics) than did residents of low- walkability neighborhoods. Also, 60% of low walkability neighborhood residents being overweight, prevalence estimates only 35% of high walkability neighborhood residents being overweight.
Burdette et al. (2004)	Cross-sectional study of 7020 low-income children enrolled in the WIC Program, aged 3- 4 years and living in Cincinnati, OH, USA.	Overweight (based on Body mass index scores).		Playground proximity, fast food restaurant proximity, and neighborhood safety.	Age, sex, race, child's poverty ratio.	Logistic regression.	No significant association was reported between child overweight and proximity to playgrounds, proximity to fast food restaurants, or level of neighborhood crime.
Ewing et al. (2004)	Cross sectional sample of 709 K–12 school trips in Florida, USA for which origin and destination traffic analysis zones.	School mode choice (walkability to schools).	Traffic analysis zone (TAZ).	Overall density, job-residence balance, job mix, commercial floor area ratio, Proportion of street miles with street trees, proportion of street miles with bike lanes or paved shoulders, proportion of street miles with sidewalks, average side walk width. Street network density Accessibility indices.	Annual household income, number of household members, per capita auto ownership, driver's license owned by student.	Multinomial logit model.	Students with shorter walk or bike times to school proved significantly more likely to walk or bike. The proportion of arterials and collectors with sidewalks along them, as well as sidewalk coverage proved to have the most significant influence on walking. Built environment did not have a significant effect on biking.
Frank et al. (2004)	Cross sectional sample of 10,878 individual respondents of the Strategies for Metro Atlanta's Regional Transportation and Air Quality (SMARTRAQ) study in Atlanta, Georgia region.	Body Mass Index.	1 Km network buffer around a household.	Built environment {Connectivity, net residential density, land use mix (4 – category, residential, commercial, office, institutional)} Physical activity (time spent in cars, distance walked).	Age, education, household income, gender and ethnicity (black male, black female, white male, white female).	Logistic regression.	Each quartile increase in LU-mix was associated with 12.2% reduction in the odds of obesity (OR=0.878, 95% CI: 0.839, 0.919). Each Km walked was associated with 4.8% reduction in the odds of obesity (OR=0.952, CI: 0.910, 0.997). An additional 60 minutes per day spent in cars translated to additional 6% odds of being obese (OR=1.001, CI: 1.001, 1.002).
Lopez (2004)	Cross sectional sample of 104084 US adult participants of the 2000 Behavioural Risk Factor Surveillance System (BRFSS).	Overweight/obesity (based on self reported measures of height and weight to calculate the BMI).	Census tract.	Urban Sprawl Index developed by the Boston University School of Public Health (scale of 0-100 based on population density of census tracts).	Age, gender, race/ethnicity, income, and education.	Multi level analysis.	Urban sprawl was significantly associated with the risk of being overweight (PR=1.002, 95% CI: 1.0006, 1.003) and obese (PR=1.005, 95% CI: 1.004, 1.006).
Duncan & Mummery	Computer-Assisted- Telephone-Interview (CATI)	Physical activity (based on Active Australia Physical	Radii of 0.5-, 0.8-, 1.0, and 1.5-km, from each	Objective GIS measures: Euclidian and street network distances to	Age, gender, income, level of educational.	Logistic regression.	Physical activity was reported to be significantly associated with GIS-derived

(2005)	survey of 1,281 residents, aged 18 year and over and living in Rockhampton, Queensland, Australia (1,215 of respondents' residential locations could be geo- coded).	Activity Questionnaire).	respondent's home.	the nearest parkland, shopping center, pathway network of 300 m, busy street (≥ 60 km/hr speed limit), and newsagent; number of 'sufficiently active' people, total amount of roadway within 20 m of a streetlight and the number of registered dogs in radii of 0.5, 0.8, 1.0, and 1.5 km, connectivity of parklands. Perceptions of physical environment: Assessed on a five-point Likert scale: items related to safety, aesthetics, accessbility, proximity to infrastructure, and opportunities for physical activity.	Self-efficacy for performing physical activity and Social support (both assessed using a five-point Likert scale).		measures of connectivity or route directness to parklands (OR=1.41, 95% Cl: 1.00, 1.98), network distance to parkland (OR= 1.41, 95% Cl: 1.01, 1.97), the number of active people in a 1-km radius (OR= 1.64, 95% Cl: 1.11, 2.43), as well as self-reported perceptions of neighborhood cleanliness (OR=2.67, 95% Cl: 1.28, 5.55). Recreation walking was found to be negatively associated with having a footpath networks beyond 400 m (OR=0.31, 95% Cl: 0.18–0.55 in reference to within a buffer of 400m). People whose home was classed as
							being in the middle tertile of registered dog numbers within 0.8 km had a positive association (OR= 1.66, Cl: 1.13, 2.43). Network distance to newsagents (OR= 1.65, 95% Cl: 1.05, 2.58), as well as good perceptions of footpath condition (OR=1.38, 95% Cl: 1.00, 1.91) were positively associated with recreational walking.
Ellaway et al. (2005)	Cross sectional sample of 6919 European residents from Angers (France), Bonn (Germany), Bratislava (Slovakia), Budapest (Hungary), Ferreira do Alentejo (Portugal), Forlì (Italy), Geneva (Switzerland), and Vinius (Lithuania) who participated in the Review of European Housing and Health Status (LARES) study.	Physical activity Overweight/obesity.	Immediate residential environment.	Objectively assessed scale of immediate residential environment based on amount of graffiti, litter, and dog mess, as well as the level of vegetation and greenery visible on the dwelling and streets immediately surrounding it.	Age, sex, socioeconomic status, and city of residence.	Logistic regression.	In residential environment containing high levels of greenery, the likelihood of being more physically active was reported to be more than three times (OR=3.32, 95% Cl:2.46, 4.50), and the likelihood of being overweight and obese was about 40% less (OR=0.63, 95% Cl: 0.49, 0.82) compared to environments with low greenery. In residential environment containing high levels of incivilities, the likelihood of being more physically active was about 50% less (OR=0.53, 95% Cl: 0.43, 0.72), while the likelihood of being overweight or obese is about 50% higher (OR=1.42, 95% Cl:1.15, 1.96)than areas with lower levels of incivilities.
Hoehner et al. (2005)	Cross sectional sample of 1053 adults from high- and low-income study areas within census tracts of St. Louis MO and Savannah GA in the US.	Physical activity behaviour; transportation activity and recreational activity (assessed from long version of the International Physical Activity Questionnaire).	400metre buffer around each individual respondent's dwelling or a 5 minute walk.	Perceived measures: Land use (perception of many destinations within walking distance, perceived counts of specific destinations), recreational facilities (perception of places to exercise, presence of parks-trail-private fitness facility, perceived count of facilities), transport environment (perception of presence of sidewalks and bike lanes, availability of public transit, safety from traffic), aesthetics (pleasantness of neighbourhood, trees along streets, free of garbage, litter or broken glass neighbourhood maintenance), social environment (perception of safety from crime, neighbourhood onlysical activity).	Age, gender, race/ethnicity, and education.	Logistic regression.	Fully adjusted models reported transportation activity to be negatively associated with objective measures of sidewalk levelness and perceived and objective neighbourhood aesthetics. It was positively associated with perceived and objectively measured number of destinations and public transit, perceived access to bike lanes, and objective counts of active people in the neighbourhood. Recreational activity was positively associated with perceived access to recreational facilities and objective measures of attractive features.

				Objective measures: Land use (number of non-residential destinations, specific purpose destinations), recreation al facilities (number of parks with facilities, Presence of at least one park, walking trail, or indoor fitness facility, total number of recreational facilities), transport environment (percent of street segments with sidewalks with no or a little unevenness, presence of bike lanes, number of bus stops, street safety score), aesthetics (segments with attractive features; trees, benches, etc; minimal garbage, litter or broken glass; physical disorder score), social environment (count of crime watch signs, count of people engaging in active behaviours).			
King et al. (2005)	Cross sectional sample of 158 overweight Caucasian and African-American post- menopausal women from the randomized clinical trial - Women on the Move through Activity and Nutrition (WOMAN) study in southwestern Pennsylvania, USA.	Total physical activity level (pedometer measured).	Census block groups, sub- divisions of U.S. Census tracts.	Housing characteristics of participants' neighborhoods (% of residents living in poverty, with less than a bachelor's degree, nonwhite and unemployed; median household income; urbanicity; and median year that homes were built) Proximity of Businesses and Facilities – within 1500 meters along the road networks (including department, discount, and hardware stores; libraries; post offices as well as parks, walking and biking trails, golf courses, shopping centers, and museums and art galleries).	Age, race/ethnicity, marital status, highest level of educational attainment, nature of employment, smoking status, BMI.	ANOVA Stepwise multiple linear regression.	After controlling for individual level covariates measures of low neighborhood SES i.e. percent of residents living in poverty ( $\beta$ =0.3807, p=0.0259), living within walking distance of a golf course ( $\beta$ =8.9218, p=0.0104) and a post office ( $\beta$ =7.0140, p=0.0357), the proxy measure of urban form i.e. living in a neighborhood with homes built between 1950 and 1969 ( $\beta$ =7.3638, p=0.0068) were all independently associated with more physical activity.
Li et al (2005b)	Cross sectional sample of 577 older adult aged 65-94 years from Portland, Oregon, USA.	Self reported neighbourhood walking.	City defined neighbourhoods (56 in number) 0.5 mile radius around the residents household.	Neighbourhood level: Number of residential households, number of places of employment (offices and commercial buildings, workplaces, etc), number of street intersections including those with traffic lights and those without (excluding freeway ramps), and total green and open spaces for recreation. Household level (0.5 mile radius): Number of street intersections, total area of green and open spaces for recreation Self reported perceived measures of proximity to local recreational facilities, physical activity facilities, safety from traffic, and number of nearby recreational facilities.	Age, sex, marital status, education, household income, and health status.	Multilevel modelling.	Density of places of employment in the neighbourhood ( $\beta$ =0.15), household density ( $\beta$ =0.27), number of street intersections ( $\beta$ =0.37), and area of green and open spaces ( $\beta$ =0.23), were all significantly related to walking activity at the neighbourhood level factors accounted for 28% of the reported variations in walking activity. At the housing level, number of recreational facilities ( $\beta$ =0.22) and areas reported by the residents that were safe for walking ( $\beta$ =0.12), were significantly related to walking activity. In addition, significant interaction was found between the variables of number of street intersections and perceptions of safety from traffic.
Rutt and Coleman (2005)	Cross sectional sample of 943 adults, primarily Hispanic population from El Paso, Texas (452 samples were geo-coded).	Body mass index.	0.25 mile radius was employed for transportation and other variables 2.5 mile radius was used	Population density, land use (percent of non-residential buildings), distance to physical activity facilities, number of physical activity facilities within 2.5 mile radius, perceived barriers to exercise, side	Age, SES, overall health, number and type of morbidities, acculturation, number of children, television time, fruit and	Structural Equation Modelling.	BMI was positively associated with moderate intensity physical activity (p=0.05), overall health (p=0.0004), SES (p=0.0003) and iving in areas with more mixed land use (p=0.03).

			to enumerate the no. of physical activity facilities around an individual's home.	walk availability, slope, intersection number and type.	vegetable consumption, and physical activity.		Increased food/ vegetable consumption (p=0.04) and younger age (p=0.02) acted as predictor of moderate physical activity. Time spent in light physical activities was associated with the number of co- morbidilies (p=0.02). Increased food/ vegetable consumption (p=0.04) was significantly associated with vigorous physical activity. A significant mediating relationship was found between self-reported overall health, perceived barriers to exercise, moderate physical activity and BMI such that people with worse overall health self reported more barriers to physical activity, less moderate physical activity and higher BMI.
van Lenthe et al. (2005)	A cross sectional sample of 8767 respondents of the GLOBE Study from 78 neighbourhoods of Eindhoven, Netherlands.	Physical inactivity (walking and cycling to shops or work; walking, cycling and gardening in leisure time, and participation in sports activities).	City neighbourhoods based on infrastructural characteristics with an average of 2200 residents.	Scores of: General attractiveness of neighbourhoods (general physical design of the neighbourhood, the quality of green facilities, amount of noise pollution from traffic) Proximity to neighbourhood facilities (availability of food shops, availability of sport and recreational facilities) Safety (amount of police attention required in the area).	Age, sex, education, occupational level of the bread winner, employment status Neighbourhood socio- economic environment.	Multivariate logistic regression.	Among participants aged 20-49 years of age, the odds of almost never walking or cycling to shops or work was lower in neighbourhoods with the most noise pollution of traffic (OR=0.80, 95% CI: 0.66–0.97) and poor physical design (OR=0.83, 95% CI: 0.69–101). Among participants aged 50-70 years, residents in the neighbourhoods with a less proximity to food shops reported significantly higher walking or cycling (OR=1.36, 95% CI: 1.09–1.69). Probability of almost never walking, cycling and gardening in leisure time was significantly higher in the tertile of neighbourhoods with the poorest general physical design (OR=1.40, 95% CI: 1.17–1.69) and highest level of noise pollution of traffic (OR=1.20, 95% CI: 1.01–1.44). Probability of almost never participating in sports activities was significantly increased in neighbourhoods with the poorest proximity to sports facilities (OR=1.27, 95% CI: 1.05–1.45) and in those requiring the most police attention (OR=1.17, 95% CI:1.00–1.38).
Frank et al. (2006)	A cross sectional sample of 1228 individuals who participated in the Neighbourhood and Quality of Life Study (NQLS) in King County, Washington Travel and demographic data was obtained from 5766 King County respondents.	Body mass index Transportation related physical activity (based on self-reported International Physical Activity Questionnaire) Vehicle miles travel Air pollution.	1 Km network buffer around a household.	Neighbourhood walkability index based on net residential density, street connectivity, 6-category land use mix and retail floor area ratio.	Age, gender, education, ethnicity, annual household income and, presence of children below 18.	Ordinary regression.	A 5% increase in neighbourhood walkability was significantly associated with a per capita 32.1% increase in time spent in physically active travel, a 0.23-point reduction in body mass index, 6.5% fewer grams of oxides of nitrogen (NOx) emitted, and 5.5% fewer grams of volatile organic compounds (VOC) emitted.
Glass et al. (2006b)	Cross sectional sample of 1140 older adults aged 50-70 years from Baltimore Memory	Obesity (based on BMI scores).	65 contiguous city neighbourhoods created by the Baltimore City	Townsend Index of Socioeconomic Deprivation Index of Neighbourhood Affluence	Age, gender, race/ ethnicity, education, household wealth, alcohol	Multilevel logistic regression.	Residents of neighborhoods in the highest quartile of the Neighborhood Psychosocial Hazards scale were nearly

	Study cohort of Baltimore, USA.		Department of Planning.	Neighbourhood Psychosocial Hazards scale.	consumption, tobacco use, self-reported physical activity, and dietary intake.		twice as likely to be obese compared to residents in the least-hazardous neighborhoods (OR= 1.96, Cl: 1.18, 3.28). Residents of neighborhoods in the highest quartile of the Townsend Index of Socioeconomic Deprivation had a higher odds of obesity as compared to the least deprived neighbourhoods (OR= 1.48, Cl: $0.95$ –2.31). The most affluent neighbourhoods had a lower odds of obesity as compared to the least affluent ones (OR= 0.63, Cl: $0.39$ – 1.02).
Gordon- Larsen et al. (2006)	Cross sectional sample of 20,745 US adolescents from the National Longitudinal Study of Adolescent Health.	Overweight (calculated from BMI based on self reported measures of height and weight) Achievement of 5 bouts per week of moderate-to-vigorous physical activity.	8.05-km (5-mile) buffer was drawn around each respondent's residence.	Number of physical activity facilities per census blocks (schools, public facilities, youth organizations, park, YMCA, public fee facilites, instruction, outdoor –sporting /recreation camps, swimming pools, athletic club and gymnasium, tennis club, basketball club, etc).	Population density, proportion of population with college degree or higher, and nonwhite proportion of the population, educational level.	Logistic regression.	Having just 1 PA facility per block group was associated with a 5% decrease in the relative odds of overweight relative to having no such facilities (OR=0.95; 95% CI: 0.90–0.99). Having just 1 PA facility was associated with an increased relative odds of engaging in ≥ 5 bouts of moderate- vigorous PA (MVPA) per week by 3% relative to having no such facilities (OR: 1.03; 95% CI: 1.01–1.06). Individuals who lived in census-block groups with 7 PA facilities were 32% less likely to be overweight and 26% more likely to be highly active than those who lived in block groups with no PA facilities.
Guite et al. (2006)	A cross sectional sample of 854 adults derived from a survey of 2696 adults in 1610 households from four areas of Greenwich, London.	SF-36v2 mental health and vitality scores.		Internal environment: Degree of satisfaction with level of control over heat, light, noise, damp and draughts Density: Overcrowding in home, road, estate or area Valued escape: Satisfaction with facilities for green space; shopping facilities; social and entertainment; community facilities; sports facilities Design and maintenance: Extent to which people liked the look of their neighbourhood, satisfaction with the maintenance of grassy areas and open spaces, flower beds, trees and bushes; play areas; and entrances to blocks <i>Crime and fear of Crime</i> : Satety while walking around in the day and night; sufficient street lighting; existence of blind spots; vandalism; graffiti; rubbish; dog mess; abandoned cars; presence of needles and syringes <i>Noise</i> : Street noise, neighbourhood noise, noise in home etc.	Age, sex, ethnicity, duration of residence in the area, the number of dependent children, number of adults in the household, pad employment, type of dwelling and number of stories, tenure, housing benefit, rent arrears, requesting re-housing, density of dwellings and local crime rates.	Logistic regression.	Fully controlled model indicated that neighbour noise (OR=2.71, 95% CI: 1.48, 4.98 for mental health), feeling overcrowded in the home (OR=2.22, 95% CI: 1.42, 3.48 for mental health and OR=1.51, 95% CI: 0.99, 2.30 for vitality), dissatisfaction with green spaces (OR=1.69, 95% CI: 1.05, 2.74 for mental health), feeling unsafe to go out in the day (OR=1.64, 95% CI: 1.02, 2.64 for mental health and OR=1.58, 95% CI: 1.00, 2.49 for vitality) and dissatisfaction with community facilities (OR=1.92, 95% CI: 1.24, 3.00 for vitality) all remained significant predictors of low SF-36v2 mental health or vitality scores or both.

Inagami et al. (2006)	Cross sectional sample of 2144 adult respondents of the Los Angeles Family and Neighbourhood Study (L.A.FANS).	BMI (based on self reported height and weight).	Census tract.	Residential neighbourhood disadvantage score (DSR), Disadvantage score of the census tract where the respondents indicated that they shopped for groceries (DSG), DSG-DSR i.e. the ddisadvantage score difference between grocery store neighbourhood and residential neighbourhood and residential access to grocery stores (centroid to centroid distance between the residential census tract and the grocery store census tract.	Age, gender, race/ethnicity, marital status, educational status, income, employment status, car ownership, neighbourhood SES.	Multilevel linear regressions.	Individuals reported higher BMI if they resided in disadvantaged areas and if the area where the average person frequents grocery stores was located in more disadvantaged neighbourhoods ( $\beta$ =0.24, p ≤ 0.01). Shopping at grocery stores located ≥ 1.76 miles was an independent predictor of increments of BMI by 0.775 units ( $\beta$ =0.78, p ≤ 0.05).
Lee & Moudon (2006)	Cross sectional sample of 438 adults, aged 18 years or older and living from the Walkable and Bikable Communities (WBC) project in the City of Seattle, USA.	Survey based walking for recreation and transport.	1 km/0.6 mile buffer area around home (for calculation of type and intensity of land uses) 3 km from home (for proximity calculations).	Perceived Environmental Variables: Neighbourhood perception (neighbourhood type, visual look, social interaction, traffic problems/ pollution), attitude (awareness of PA, agreement to walk/bike, awareness of congestion/pollution). Objective Environmental Variables: (Distance to the closest grocery store, restaurant, fitness centre, park, trail), Number of retail stores within 1 km buffer, Total length of sidewalks within 1 km buffer, Mean traffic volume within 1 km buffer Total number of street trees, mean block size, total number of bus ridership within 1 km buffer Net and parcel level residential density, mean slope within 1 km buffer) Others - (Distance to the closest bank, day care, office, church, convenient store, school, post office, parcel density).	Demographics: Age, gender, race, marital status. Behavioural: transit use, walking in neighbourhood, vehicle miles traveled per month, frequency of walking for transportation purposes, recreational purpose. Household: Car ownership, dog ownership.	Multinomial logit models.	The study reported that utilitarian destinations were beneficially associated with transportation walking. However, recreational destinations were not associated with both categories of walking. Residential density was correlated with both categories of walking, and sidewalks with recreation walking only. Hilly terrain as well as proximity to day care were positively associated with recreation walking.
Maas et al. (2006)	Cross sectional sample of 250782 Dutch residents registered to 104 GP from the second Dutch National Survey of General Practice dataset.	Perceived general health (self rated).	1.0- and 3.0 Km radius around the respondent's residence.	Total percentage of green space (urban green, agricultural green, forests, and nature conservation areas) within a 1 km radius and within a 3 km radius around a respondent's home Urbanity (based on a 5 point score).	Socio-demographic: age, sex, income, and education. SES: highest level of completed education, the work situation, type of health insurance and ethnicity.	Multilevel logistic regression.	The percentage of green space inside a 1 Km and a 3 Km radius had a significant relation to perceived general health. Perceived general health was associated with both agricultural green (1 km: $\beta$ =0.004, SE=0.000; 3 km: $\beta$ =0.004, SE=0.001; and natural green (1 km: $\beta$ =0.004, SE=0.001; 3 km: $\beta$ =0.006, SE=0.001) in a person's living environment The relation was generally present at all degrees of urbanity.
Mobley et al. (2006)	Cross sectional sample of 2692 women enrolled in the WISEWOMAN program from Connecticut, Nebraska, North Carolina and South Dakota, USA.	Body mass index Log of 10-year risk for coronary heart disease (CHD).	Zip code level (from the US Census & US Geological Survey data, 222 in all).	ZIP code level: Land use mix, Number of fitness facilities, full-sized grocery stores, fast food establishments, restaurants, and minimarts expressed as per 1000 residents County level: percent of workforce	Individual: Age, race/ ethnicity, education level, smoking Socio-ecologic: Index of racial segregation and income factor at the ZIP	Ordinary least squares regression.	The average BMI for women living in an environment of maximum mixed land use was 2.60 kg/m <sup>2</sup> lower ( $p$ <0.05), and CHD risk was 20% lower ( $p$ <0.05), than for women living in a single-use environment.

				commuting outside County.	code level; no. of robbery arrests per 100,000 residents and Income inequality at county level.		An additional fitness facility per 1000 residents was associated with significantly lower BMI and CHD risk, by 1.39 kg/m2 and 15.1%, respectively ( $(p<0.05)$ ). Crime was positively associated with BMI and CHD risk, whereas neighbourhood affluence was negatively associated.
Morland et al. (2006)	Cross sectional sample of 10 763 respondents participating in the Atherosclerosis Risk in Communities (ARIC) Study from Mississippi, North Carolina, Maryland, and Minnesota, USA.	Cardiovascular disease (CVD) risk factors: Two categories of body weight (overweight and obesity), diabetes, hypertension, and hypercholesterolemia.	Census tracts containing approximately 3000 to 4000 individuals, were used as proxies for neighbourhoods (207 in total).	Presence of food stores/service places (supermarket, grocery store, convenience store, full service restaurant, franchised fast food restaurant, limited service restaurant) per census tract.	Age, gender, education, income, race/ethnicity, and physical activity.	Binomial regression using random effects generalized linear models.	The presence of supermarkets was associated with a lower prevalence of obesity (PR=0.83, 95% CI: 0.75, 0.92) and overweight (PR=0.94, 95% CI: 0.90, 0.98). On the contrary, the presence of convenience stores was associated with a higher prevalence of obesity (PR=1.16, 95% CI: 1.02, 1.27) and overweight (PR=1.06, 95% CI: 1.02, 1.10). Also overweight ad obesity was positively associated with the presence of supermarkets and convenient stores (PR=1.11 95% CI: 1.00, 1.23) as well as grocery stores and convenient stores (PR=1.18 & PR=1.60).
Nelson et al. (2006)	Nationally represented cross sectional sample of 20745 adolescents of grade 7-12 from the National Longitudinal Study of Adolescent Health in the USA.	Self reported daily physical activity and obesity.	3 Km Euclidean buffer around each respondent's residence.	Number of physical activity facilities Walkability (3-way and 4-way intersection density, α-index, γ-index, cyclomatic index) Road type (proportion of A1 and A4 roads and their absolute total length).	Age, Census block group measures: Education (Proportion of adults with college degree), SES (housing units occupancy status, home age, mobility, proportion working in county of residence), Poverty (proportion of people with incomes <185% of poverty level), ethnicity (minority (proportion of nonwhites), crime (serious crimes/100,000 persons).	Cluster analysis Poisson Regression (parameter estimates - Adjusted Risk Ratio).	Six robust neighbourhood clusters were identified: rural working class; exurban; newer suburban; upper-middle class, older suburban; mixed-race urban; and low-socioeconomic-status (SES) inner- city areas. Compared to adolescents living in newer suburbs, those in rural working-class (ARR=1.38, 95% CI: 1.04, 1.64), exurban (ARR=1.30, 95% CI: 1.04, 1.64), and mixed-race urban (ARR=1.31, 95% CI: 1.05, 1.64) neighbourhoods were more likely to be overweight, independent of individual SES, age, and race/ethnicity. Adolescents living in older suburban areas were more likely to be physically active than residents of newer suburbs (ARR=1.11, 95% CI: 1.04, 1.18).
Norman et al. (2006)	Cross sectional sample of 799 adolescents, age 11 to 15 from San Diego County, USA.	Physical activity (accelerometers measured) Body mass index.	1 mile buffers around residences with distances based on the street network.	Access to recreational facilities Community design: residential density, intersection density, land use mix, retail floor area ratio, and an index of neighborhood walkability.	Age, ethnicity, highest adult household education.	Hierarchical multiple linear regression.	Number of nearby recreation facilities ( $\beta$ = 0.11, p=0.05) and number of nearby parks ( $\beta$ = 0.14, p=0.01) were positively associated with girls' physical activity, while intersection density ( $\beta$ = -0.14, p=0.01) was inversely related to girls' physical activity. Retail floor area ratio ( $\beta$ = 0.12, p<0.05) beneficially associated positively with boys' physical activity.

Araya et al.(2007)	A cross sectional sample of 3870 adults in Greater Santiago area, Chile.	Psychiatric disorders (assessed with the Revised Clinical Interview Schedule-CIS-R).	Boroughs and small geographical sectors (based on the Chilean Office of National Statistics).	25-item Built Environment Assessment Tool (BEAT) scores measured for geographical sectors. They comprised of four component factors (general quality of the area; facilities, noise and traffic in the area; public green areas; and empty sites).	Age, gender, presence of disease, income, education, marital status, housing type, number of supportive individuals and alcohol use, episodes of violent crime (sector level), and borough variables (education budget per capita, health budget per capita and number of social organisations).	Multilevel regression modelling.	Fully controlled model reported a beneficial association between factor 1 (overall quality of the built environment) and CIS-R based psychiatric disorder ( $\beta$ =-0.30, 95% CI: -0.49, -0.11). There was a significant negative association between factor 4 (presence of empty sites) and mental health ( $\beta$ =0.17, 95% CI: 0.06, 0.28).
Berke et al. (2007b, 2007a)	Cross sectional sample of 740 and 936 respondents from the Walkable and Bikable Communities Project in King County, Washington.	Self reported walking for exercise, body mass index and Centre for Epidemiologic Studies Depression Scale.	100, 500 and 1000 metres Euclidean buffer around a respondent's dwelling.	Neighbourhood walkability score which comprised of components of shorter distance to closest grocery store; more dwelling unit per acre; more grocery store, restaurant, or retail density; fewer educational parcels; fewer grocery stores or markets within 1-km buffer; smaller size of closest office complex; longer distance to closest office/mixed-use complex and smaller size of block where residence is located.	Age, ethnicity, income, education, chronic disease burden score, smoking.	Logistic regression.	Living in highly walkable neighbourhoods were significantly associated with more walking for exercise (OR=5.86; 95% CI: 1.01, 34.17 to OR=9.14; 95% CI: 1.23, 68.11 for men and OR=1.63; 95% CI: 0.94, 2.83 to OR=1.77; 95% CI: 1.03, 3.04 for wormen). Living in highly walkable neighbourhoods were also associated with lower odds of depression only among men (OR=0.31; 95% CI: 0.12, 0.81 to OR=0.33; CI: 0.14, 0.82.
Bernstein et al. (2007)	Cross sectional sample of 1355 residents of New York City, USA.	Alcohol use in the past 30 days.	59 community districts of New York City.	External built environment: Percent of buildings in dilapidated condition, deteriorating condition, with external wall problems, window problems, interior or exterior stairway problem, and number of structural fires. Internal built environment: Percent of housing units with toilet breakdowns, non- functional kitchen facilities, experiencing more than three heating breakdowns in winter, with internal water leakage, with large area of peeling paint/plaster.	Age, race/ethnicity, sex, educational attainment and income.	Multilevel logistic regression.	Living in a neighbourhood characterized by units with large areas of peeling paint or plaster (OR=1.33, 95% CI: 1.08, 1.65) and internal water leakage (OR=1.30, 95% CI: 1.01, 1.66) had greater odds of drinking in the last 30 days. Heavy alcohol use was significantly associated with percent of buildings with window problems (OR = 2.05, 95% CI: 1.03, 4.09); stairway problems (OR = 2.34, 95% CI: 1.13, 4.86); percent of units with more than three heating breakdowns in winter (OR = 2.42, 95%, CI: 1.33, 4.43); needing additional heat in winter (OR = 2.18, 95% CI: 1.13, 3.46), and internal leakage(OR = 2.55, 95% CI: 1.61, 4.05).
Boehmer et al. (2007)	Cross sectional sample of 1032 randomly selected urban residents of from two US cities of Savannah, Georgia and St. Louis, Missouri.	Obesity (obese vs. normal weight, obese/inactivity vs. normal weight/active) measured from self reported body mass index.	400 metres (equivalent to 5 minutes walk) radius surrounding each respondent's residence.	Perceived and objective environmental indicators: Recreational facilities (number and access to recreational facilities, presence of equipment for physical activity); land use (non-residential destinations); transportation (sidewalks, access to transit stops, traffic safety); aesthetics (pleasantness of community, presence of atratege, litter, broken olass:	Age, gender, education.	Logistic regression.	Being obese was significantly associated with perceived indicators of no nearby non-residential destinations (OR=2.2, 95% CI: 1.3, 3.5), absence of sidewalks (OR=2.2, 95% CI: 1.1, 4.3), unpleasant community (OR=3.1, 95% CI: 1.5, 6.5) and lack of interesting sites (OR=4.8, 95% CI: 2.4, 9.8) as well as observed indicators of poor side walk quality

				maintenance).			(OR=2.1, 95% CI: 1.3, 3.6), physical disorder (OR=4.0, 95% CI: 2.3, 7.0), and presence of garbage (OR=3.7, 95% CI: 2.1, 6.6).
Boer et al. (2007)	Cross sectional sample of 29724 respondents from 10 largest consolidated metropolitan statistical areas of Boston, Chicago, Dallas, Detroit, Houston, Los Angeles, New York, Philadelphia, San Francisco, and Washington, USA who participated in the National Personal Transportation Survey (NPTS).	Walking trips.	0.25 mile radius of the centroid of the block group of the household.	Housing density, fraction of 4-way intersection, block length, land use mix (business diversity score; number of different types of businesses in a neighborhood), parking pressure (number of residents per foot of parkable street length).	Age, gender, household size, Hispanic ethnicity, race, CMSA, individual education, job status and household life cycle.	Logistic regression.	Higher levels of business diversity and higher % of 4-way intersections were beneficially associated with walking. Moving from two different business types in the neighborhood to three types (OR=1.15, 95% CI: 1.01, 1.320) as well as four different business types (OR=1.24, 95% CI: 1.01, 1.39) significantly improved the probability of walking, Neighbourhoods with 50%–74% four-way intersections had higher odds of walking of (OR=1.4, 95% CI: 1.09, 1.78) relative to those with 25%–49% four-way intersections.
Cerin et al. (2007b)	124 participants aged 20-65 years from four objectively identified neighbourhood (with extreme values of walkability and SES representing high walkable- high SES, high walkable-low SES, low walkable-high SES, low walkable-low SES) of Hong Kong.	Reliability and concurrent validity study of Chinese version of Neighbourhood Environment Walkability Scale for measuring the objective and perceived attributes of neighbourhood environment for walking.	400 metres crow fly buffer surrounding specific street block.	Chinese version of Neighbourhood Environment Walkability Scale (NEWS-A) comprising of: Multi-item scales of residential density, land use mix diversity, access to services, street connectivity, infrastructure and safety for walking, aesthetics, traffic safety and safety from crime. Single item scales of access to parking, hilly streets, physical/natural obstacles, and presence of cul-de-sacs. Neighbourhood SES.		Intra-class correlation coefficient to examine the variance in Chinese NEWS-A subscale owing to between neighbourhood differences Spearman's correlation to test reliability of single items.	Residents from highly walkable neighbourhoods provided ratings indicative of higher residential density, land use mix diversity, access to services, street connectivity, infrastructure and safety for walking and fewer cul-de-sacs and hills, less traffic, lower levels of environmental aesthetics.
Cerin et al. (2007a)	Cross sectional sample of 2650 residents from 32 urban neighbourhoods aged 20-65 from the Physical Activity in Localities and Community Environments (PLACE) study in Adelaide, Australia.	Weekly minutes of walking for transport (based on the long version of International Physical Activity Questionnaire; IPAQ), monthly frequency of walking to specific destinations.	Census collection districts (CCD), 154 in total.	Objective index of land use mix (LU entropy). Objective profile of LUM (based on clustering of census collection districts with similar average proportion of land uses). Perceived LUM (number of reported destinations within 5, 6-10, 11-20 minutes). Perceived proximity of access to non- residential destinations (commercial, home/car commercial destinations, schools, workplace, bus/train stop, recreational, beach/river destinations) - based on subscale of the Neighbourhood Environment Walkability Scale (NEWS). Neighbourhood selection (Likert type scale of perceived importance of neighbourhood in terms of closeness to open space, jobs or school, public transport, shops and services, recreational facilities).	Age, gender, educational attainment, marital status, annual household income before taxes, employment status, ethnicity, number of children under 18, children's age, household size.	Generalized Linear Modelling.	No significant associations between objective index of LUM Weekly minutes of walking for transport. Objective profile of LUM was positively correlated with walking for transport. Residents of commercial/industrial areas reported 39.6 more weekly walking minutes (95% CI: 0.4, 78.9) than the residents of recreational CCDs. Positive association was reported between different types of destinations within a 5-minute from home and weekly minutes of walking ( $\beta$ =3.8, 95% CI: 1.2, 6.3). Positive association was reported between different types of destinations and weekly minutes of walking ( $\beta$ =3.8, 95% CI: 1.2, 6.3). Positive association was reported between proximity of commercial and workplace destinations and weekly minutes of walking ( $\beta$ =15.1; 95% CI: 3.3, 26.8). Significant association existed between proximity of types of destinations and monthly frequency with and without controlling for neighbourhood selection with the exception of train/bus stops.

Diez Roux et al. (2007)	Cross sectional sample of 2,723 adult residents, aged 45 to 84 years from the Multi- Ethnic Study of Atheroscherosis (MESA) and living in New York City, NY; Baltimore, Md; and Forsyth County, NC, USA.	Physical activity (based on semi-quantitative questionnaire adapted from Cross-Cultural Activity Participation Study).	0.5- (0.8 km), 1-, 2-, and 5- miles of each participant's residence.	Total number of parks Population adjusted density of recreational resources (Team sports, Dual sports, Running areas, water activities, tai-chi, pilates, yoga, martial arts; aerobics, cardiovascular equipment weight training; gymnastics and dancing; Skating, skiing; golf; others), total number and acreage of parks within buffer.	Age, gender, race/ ethnicity, income, and perceived neighborhood violence.	Binomial Regression.	Density of resources was positively associated with physical activity for neighbourhoods ranging from 1 mile to 5 mile (with prevalence ratios were 1.15, 95% CI: 1.04, 1.27 for 2 miles; and PR=1.06, 95% CI: 0.96, 1.18 for 5 miles). These associations were slightly stronger among minority and low-income residents.
Jilcott et al. (2007)	Cross sectional sample of 199 women enrolled in the randomized trial conducted by the WISEWOMAN program from three counties in southeastern North Carolina, USA.	Moderately vigorous physical activity (MVPA) – accelerometer measured.	1- and 2-mile Euclidean or crow flies buffer of respondent's dwelling.	Perceived proximity to resources: Perceived distance to nearest school, gym or recreation center and park; presence of school, gym or recreation center and park within a 10-minute drive from home. Objectively measured proximity: Road network distance of the participant's home to closest PA resource and number of each type of PA resource in 1- and 2- mile buffer.	Age, race, BMI, education, baseline self-reported annual household income, smoking status, and urbanicity.	Multiple linear regression.	Greater perceived distance to gyms ( $\beta$ =-0.19, p=0.05) and objective number of schools ( $\beta$ =-0.17, p=0.03) were negatively associated with less minutes of MVPA. No significant relationships were found between physical activity and perceived or objectively measured proximity to parks.
Kligerman et al. (2007)	Cross sectional sample of 98 white or Mexican-American adolescents, aged 14.6-17.6 years from San Diego County, California, USA.	Physical activity (accelerometer measured).	0.25-, 0.5-, and 1 mile, with distances based on street networks.	Walkability index (based on land use mix, net residential density, intersection density and retail FAR) Shortest distance to the nearest public or private recreation facility Total number of recreation facilities within the buffered areas.	Age, gender, ethnicity, BMI, Parent-reported marital status, employment status, parent education, household income, number in household, and parent age.	Linear regression.	None of the recreation facility variables was related to Moderate to vigorous physical activity (MVPA). Walkability index at 0.5-mile buffer was beneficially associated with MVPA (B=0.278, 95% Cit. 285, 1.864) and explained approximately 4% of variance.
Rundle et al. (2007)	Cross sectional sample of 13102 adult respondents of the New York Cancer Project from 1989 census tracts in five boroughs of New York.	Body mass index.	Census tract.	LU mix, access to public transport, population density, intersection density.	Age, gender, race/ethnicity, education, pretax income, census tract-level poverty, and interactions between gender and race/ethnicity.	Multilevel model.	Fully adjusted model reported significant inverse associations between BMI and mixed land use ( $\beta$ =-0.46, 95% Cl: -0.88, -0.04), subway stops ( $\beta$ =-0.04, 95% Cl: -0.08, -0.004), and population density ( $\beta$ =-0.24, 95% Cl: -0.31, -0.17).
Stafford et al. (2007b)	Cross sectional sample of 6848 adult respondents of the Health Survey of England and Scottish Health Survey.	Body mass index, waist to hip ratio.	Local authority (LA) as well as post code sector (PCS).	Number of high street services (pharmacies, optical, dental practices, libraries, banks, building societies, bingo halls, PCS), leisure centres (number of swimming pools and expenditure of leisure and recreation in LA), population density in PCS, food environment (number of fast food outlets and supermarkets), crime (violent crime /1000 residents in LA), policing (number of special constables, police in LA), physical dereliction (number of missed waste collection/100000, vacant and derelict land area in LA), Perceived social disorder in PCS. Physical activity (average proportion of people participating in sports club in PCS).	Age, gender, social class,	Structural equation model	BMI model: Neighbourhood social disorder was positively associated with number of police officers and presence of vacant/derelict land and negatively associated with number of special constables. BMI was negatively associated with average sports participation rate (standardized path coefficient; spc = $0.038$ ), high street facilities (spc= $0.038$ ) and proximity to a post office (spc= $0.039$ ) and proximity to a post office (spc= $0.039$ ) and proximity to a post office (spc= $0.039$ ) and proximity natio was positively associated with neighbourhood disorder (spc= $0.053$ ) and negatively associated with population density (spc= $-0.041$ ).

Tiit et al. (2007)	Cross sectional sample of 529 residents of Seattle, Washington, USA.	Walking trips per month Body mass index.	0.4 miles of walking distance of residential parcels.	Objective accessibility: Number of destinations (churches, community centers, libraries, neighborhood communal garden spaces, parks, playgrounds, post offices, schools, swimming pools, and theaters, banks, bars, grocery stores, and restaurants) that are within defined neighbourhood. Measure of greenness: Normalized Difference Vegetation Index (NDVI) of walkable neighbourhood for each parcel. Self-reported destinations. Self-reported natural features. Self-reported satisfaction with greenness. Perceived importance of destinations.	Age, gender, education, income.	Multiple regression.	Walking trips per month were beneficially associated with objective accessibility ( $\beta$ =2.269, p < 0.0001), subjective greenness ( $\beta$ =2.047, p < 0.0001). There was no significant relationship with objective measures of actual greenness and satisfaction with greenness. An interaction effect between objective accessibility and objective greenness with respect to BMI. High NDVI areas reported a negative relationship between BMI and objective accessibility, while low NDVI areas reported a slight positive relationship.
Thomas et al. (2007)	A cross sectional sample of 1058 respondents who participated in the Housing and Neighbourhood and Health (HANAH) study in the Neath Port Talbot borough of South Wales, UK.	Mental disorders measured by the 12-item General Health Questionnaire.	UK census defined postcodes.	28 item score of Residential Environment Assessment Tool (REAT) - comprising of components of physical incivilities, territorial functioning, defensible space, natural environment and miscellaneous Composite geographical accessibility score.	Gender, age, working status, financial status, number of unaffordable lifestyle items, household level proportion of income from benefits, household crowding, level of social support and post code level socio-economic deprivation.	Multilevel modelling.	There was no significant association of residential environment quality and accessibility with mental disorders. Only 2 % of the unexplained variations in psychological distress were attributed to the neighbourhood (postcode) level, while 37% existed at the household level.
Forsyth et al. (2008)	Cross sectional sample of 715 participants in 36 environmentally diverse areas in Twin Cities Metropolitan area, Minnesota.	Self reported walking (transport & leisure), physical activity behavior (7-day travel/walking diary and the long form of the International Physical Activity Questionnaire, IPAQ), and total physical activity (objectively measured by accelerometer).	Straight line and network buffers around the participant's residence at 200, 400, 800, and 1600 metres.	Street pattern (road length per unit area; no. of access points; intersections per unit area4-way intersection/all intersections; onnected node ratio). Pedestrian oriented design (sidewalk per unit area; sidewalk length/road length; street light & street trees per length of street, % of street segments with marked pedestrian crossings; litter, griffitti or dumpsters; traffic calming; proximity to transit stops; transit stop density). Destinations (% of total parcel area in commercial, industrial, tax-exempt, vacant; % of land area in night-time use, social uses; retail, industrial and auto oriented uses; dissimilarity index, entropy index, Herfindahl-Hirschman Index, employment per unit land area, retail employment per unit area; employee density in general merchandise, food stores, eating & drinking, misc. retail; proximity measures). Perceived measures (street pattern, pedestinat oriented design and destination elements).	Age, gender, race, marital status, education, tenure, homeownership, car ownership, household size, and overall health.	Correlation analysis, logistic regression.	Land use mix was reported to be negatively correlated with physical activity outcomes. Significant but weak associations were observed between walk outcomes and intersection per unit area, side walk length, and the density of food service employment.

Leslie & Cerin (2008)	Cross sectional sample of 2194 respondents from the Physical Activity in Localities and Community Environments (PLACE) study in Australia.	Neighbourhood satisfactions (domains comprised of: Safety and walkability, access to destinations, social network, travel network, and traffic and noise) and mental health assessed by self reported SF-12 questionnaire.	Census Collection Districts (CCD).	Perceived environmental characteristics were measure using the Australian version of Neighbourhood Environment Walkability scale. It comprised of components of perceived neighbourhood density, land use mix, access to services, street connectivity, infrastructure for walking and cycling, aesthetics and greenery, traffic load, traffic safety, crime, hilliness, physical barriers to walking, presence of cul-de-sacs and parking difficulty.	Age, gender, educational attainment, annual household income, and CCD-level median house hold size and median weekly income.	Generalised lin ear models.	Perceived environmental characteristics of aesthetics and greenery, land use mix – diversity, street connectivity, traffic safety, infrastructure for walking, access to services and barriers to walking were found to be positively associated with neighbourhood satisfaction domains, while traffic load and crime were neg atively associated. Three domains of neighbourhood satisfaction; safety and walkability ( $\beta$ =1.53, CI: 0.77, 2.29); and social network ( $\beta$ =1.74, CI: 1.31, 2.17) and traffic and noise ( $\beta$ =0.80, CI: 0.36, 1.24) were significantly associated with mental health.
Li et al. (2008)	Cross sectional sample of 1221 residents aged 50-75 years from 120 neighbourhoods in Portland OR.	BMI Physical activity (measured in terms of neighbourhood walking, walking for transportation, walking for household errands and meeting the physical activity recommendation).	798 census block groups within the urban growth boundary of Portland Metropolitan area.	Land use mix, density of fast food outlets, density of street connectivity, density of public transit stations, acreage of green and open spaces.	Age, gender, race/ ethnicity, marital status, employment status, education, household income, living situation, home ownership, alcohol use, tobacco use, general health status, BMI, fruit and vegetable intake, and fried fruit consumption.	Multilevel Poisson regression.	Land use mix was significantly associated with reduced odds of obesity (PR=0.749, 95% CI: 0.624, 0.899). But, density of fast food outlets was associated with increased odds of obesity (PR=1.069, 95% CI: 1.031, 1.108). Furthermore, higher mixed-use land was positively associated with all three types of walking activities and the meeting of physical activity recommendations. Higher street connectivity, density of public transit stations, and green and open spaces were also related in varying degrees to walking and the meeting of physical activity recommendations.
Mujahid et al. (2008b)	Cross sectional sample of 2865 participants of the Multi- Ethnic Study of Atherosclerosis (MESA), aged 45–84 years and residing in Maryland, New York, and North Carolina.	Body mass index	Census tracts as proxy neighbourhoods. Survey measured BE within 1 mile (1.6 km) buffer surrounding the participant's home.	Self reported survey identified two factors. Neighbourhood physical environment factor comprising of measures of walking environment (seven items) and availability of healthy foods (three items). Neighborhood social environment factor comprising of measures of aesthetic quality (five items), safety (three items), violent crime (four items), and social cohesion (four items).	Age, gender, race/ ethnicity, education, income, time lived in neighbourhood, diet, energy intake, physical activity.	Factor analysis, marginal maximum likelihood estimation methods.	Fully adjusted models reported that individuals residing in better physical environments had a lower mean body mass index (estimate = -0.69, 95% CI: - 1.67, 0.29 for women and estimate = - 0.44, 95% CI:-1.09, 0.22 for men) than those residing in worse environments. Men who resided in better social environments had a higher mean body mass index than those residing in worse environments (estimate = 0.53, 95% CI: 0.03, 1.02). A significant attenuation of the associations after adjustment for diet and physical activity was reported indicating a mediating role of behavioural factors.
Nagel et al. (2008)	Cross sectional sample of 546 community-dwelling older adults in Portland, Oregon from the Senior Health and Physical Exercise (SHAPE) study.	Total weekly walking time (calculated by summing the brisk walking and leisure walking items from the Yale Physical Activity Scale Activities Checklist).	0.25- and 0.5- mile, buffer around respondent's dwelling.	Number of commercial establishments, select establishments, percentage of high, medium and low volume streets, percentage of sidewalks, numbers of intersections, number of bus lines, and distance to parks.	Age, gender, race, educational level, household income, self-reported health status, walking self-efficacy, poverty, neighbourhood	Multilevel regression analysis.	Within a quarter mile radius, a higher number of commercial establishments ( $\beta$ = 0.23, p < 0.001), select establishments ( $\beta$ = 0.60, p = 0.024), and a greater percentage of high- volume streets ( $\beta$ = 1.00, p = 0.048) were

					problems and safety.		all beneficially associated with increased total walking time, while, a higher percentage of low-volume streets ( $\beta$ = -1.16, p = 0.004) was associated with fewer minutes walked per week. At the half-mile buffer, similar associations were observed between total walking time and number of commercial establishments ( $\beta$ = 0.06, p = 0.002), select establishments ( $\beta$ = 0.015, p = 0.015) and low-volume ( $\beta$ = -1.69, p < 0.001) streets.
Smith et al. (2008)	Cross sectional sample of 453927 residents from 564 block groups of Salt Lake County, Utah aged 25–64 years.	BMI Overweight Obesity.	Neighbourhood definitions varied between census tract, block group, 0.25 mile of resident's home.	Density (population per square mile in block group), number of intersections within 0.25 mile of the resident's home, proportion workers walk to work in block group), housing age (census tract level).	Age, gender, Block group level: Ethnic composition, median family income, and the median age of individuals.	Linear & logistic regression.	Higher intersection density was related lower risk of being overweight (OR= 0.991, 95% CI: 0.985, 0.997) and obesity (OR= 0.988, 95% CI: 0.980, 0.996) for men and the lower the risk of overweight for women (OR= 0.993, 95% CI: 0.985, 1.000). Increases in the proportion of residents in the neighbourhood who walk to work were associated with a lower risk of overweight and obesity for both men (OR=0.958, 95% CI: 0.950, 0.965 and OR=0.911, 95% CI: 0.920, 0.965 and OR=0.930, 95% CI: 0.260, 0.946 and OR=0.930, 95% CI: 0.260, 0.946 and OR=0.930, 95% CI: 0.260, 0.946 and OR=0.930, 95% CI: 0.260, 0.945 associated with lower the odds of overweight and obesity.
Wells & Yang (2008)	Cross sectional sample of 70 low income primarily African American women in southeastern US for between group comparison of difference in post-move walking among those living in neo-traditional and suburban neighbourhoods. Longitudinal sample of 32 women to assess the walking levels prior to and after relocation to new neighbourhoods.	Walking using pedometers.	Area within 0.25 mile of the residence along the street network (network buffer zone; NBZ).	Density (population density, employment density, housing density, service job density); land use mix (service- jobs/population ratio, job/resident ratio); street network characteristics (total linear length of street, number of street intersections, number of cul-de-sacs in the NBZ). Design features (mean lot size, setback distance, presence of sidewalks, front porches, public open space).	Age, race/ethnicity, marital status, household size, number of adults in household, no. of children in household, BMI, ethnicity.	General Linear Modelling for cross- sectional analysis, mixed modeling for the longitudinal study.	Cross sectional analysis: Levels of walking in neo-traditional neighbourhoods were slightly higher (62.207 steps/week) than in the suburban neighbourhoods (58,617 steps/week). Fully adjusted models indicated that African-American women walked 20,184 fewer steps per week (50,320 steps/ week) than non-African-American women (70,504 steps/week). Furthermore, women walked approximately 5600 more steps per week for each additional household member. Longitudinal analysis: Pre-move to post move in areas with higher land use mix i.e. increases in the service-jobs-to-residents ratio from pre- to post-move were negatively associated with walking (31,820 fewer cul-de- sac predicted more walking (5303 more steps per week).

Brown et al. (2009a)	Cross sectional sample of 5000 randomly chosen residents of Salt Lake County, Utah aged 25-64 years.	Body mass index, overweight, obesity.	1 Km street network buffer around each residence.	Land use mix (6-, 3-, and 2-category); proxy based measure (proportion of residents who walk to work, tract housing age); area of land uses in the mix scores (multi & single family residences, retail, office, education, entertainment); destinations based variables (Km to rail, bus stop, park in buffer); and intersection density.	Age, median family income in the census block group (BG), BG racial/ethnic composition, median age of residents in the BG, population density of BG.	Correlation analysis, generalized estimating equations.	Older neighbourhoods with higher 6- category LU mix and nearer to rail stops had better health outcomes. Male: BMI was beneficially associated with more multi-family residences ( $\beta$ =- 2.27, p=0.03); tract housing age ( $\beta$ =- 0.02, p=0.001) and non-beneficially with intersection density ( $\beta$ =0.02, p=0.01). Lower rate of overweight related to more office space ( $\beta$ =-3.38, p=0.05). Female: Lower BMI positively associated with higher tract housing age ( $\beta$ =-0.03, p=0.02), more entertainment space ( $\beta$ =-3.48, p=0.02), closer to rail stops ( $\beta$ =0.12, p=0.00). Higher risks of obesity related to more educational space ( $\beta$ =4.16, p=0.04), less entertainment ( $\beta$ =- 12.1, p=0.04), more distant to rail stops ( $\beta$ =0.06, p=0.00).
Dengel et al. (2009)	Cross sectional sample of 188 adolescents from Minnesota, USA who enrolled in the Trans-disciplinary Research on Energetics and Cancer—Identifying Determinants of Eating and activity (TREC-IDEA)study.	Metabolic Syndrome (MetS) based on MetS cluster score. This was calculated as the sum of the z-scores of percent body fat, fasting glucose, HDL-C (negative), TG, and systolic blood pressure.	1.6 km street network buffer around a respondent's dwelling.	Residential density, land use mix (expressed as employment density, percent land use under residential, parks and recreation, vacant), street pattern (expressed as intersection density, median block size, number of access points), density and distance to fast food and non-fast food restaurants, density and distance to grocery stores, convenience/gas, distance to parks, distance to physical activity facilities (gym, recreation centre, walking/biking trail, school).	Age, sex, pubertal status.	Spearman correlation and multivariate regression.	Spearman correlation reported significant relationships between the built environment variables and the components of MetS. A significant association was reported between an increased distance to convenience stores and the MetS ( $\beta$ =-0.0002, p=0.04).
Garden & Jalaludin (2009)	Cross sectional sample of 7290 residents of the NSW Population Health Survey of 2002 and 2003, aged 16 and above and living in New South Wales, Australia.	Overweight, obese (both based on self reported BMI scores), inadequate physical activity, and minutes walked in last week.	Local governing areas (LGAs)	Sprawl (measured by population density) Area variable (2001 Index of Relative Socio-Economic Disadvantage).	Age, gender, household income, highest level of education completed, current smoking status, adequate diet, number of years lived in neighbourhood, and perceived safety.	Multilevel logistic regression.	The fully controlled model reported that each inter-quartile increase in sprawl was associated with higher odds of being overweight (OR=1.26, 95% Ct 1.10, 1.44), higher odds of being obese (OR=1.47, 95% Ct 1.24, 1.75), and higher odds of inadequate physical activity (OR=1.38, 95% Ct 1.21, 1.57). The the odds of not spending any time walking during the past week was (OR=1.58, 95% Ct 1.28, 1.93) for an inter-quartile increase in sprawl.
Lee et al. (2009)	Harvard Alumni Health Study, US: Cross sectional sample of 4997 men in the 1993 and 4918 men in the 1988 as well as a longitudinal sample of 3448 men for longitudinal associations between	Physical activity (self reported), physician-diagnosed hypertension, high cholesterol, and diabetes.	County.	Sprawl index based on gross population density, percentage living at low and at high densities, county population per square mile of urban land, average block size, and percentage of blocks 500 feet or smaller on a side.	Age, smoking habits, overweight, diet (1988 only).	Logistic regression for cross sectional analysis. Linear regression for the longitudinal study.	Cross sectional analysis reported that in reference to individuals living in high sprawl areas, those in the low sprawl were beneficially associated with more walking for meeting physical activity recommendations (OR=1.38, 95% CI: 1.09, 1.76 in 1993 and OR=1.53, 95% CI: 1.19, 1.96 in 1988), lower prevalence of

	changes in exposure to urban sprawl for movers and physical activity over the period 1988-93.						overweight (OR=0.79, 95% CI: 0.64, 0.98 in 1993 and OR=0.81, 95% CI: 0.66, 1.00 in 1988) as well as hypertension (OR=0.76, 95% CI: 0.61, 0.95in 1993 and OR=0.76, 95% CI: 0.60, 0.95 in 1988). Longitudinal analysis results were insignificant.
Li et al. (2009b)	Longitudinal study based on 1 year follow-up of 1145 older adults from Portland, Oregon who participated in the Portland Neighbourhood Environment and Health Study.	Systolic and diastolic blood pressure.	Census block group.	Walkability index (comprising of components of land use mix, street connectivity, number of public transit stations, amount of green and open spaces) Density of fast food restaurants Eating out behaviour Fruit and vegetable intake.	Age, gender, education, household income, race/ethnicity, alcohol use, smoking, use of blood pressure medication, residence density, median household income, percent of non-hispanic black and hispanic residents.	Multilevel regression	Significant reduction in systolic and diastolic pressure (-4.46 and -3.63 respectively at p<0.001) were reported among respondents living in high walkable neighbourhoods. For the low walkable neighbourhoods, density of fast food restaurants was significantly associated with increases in systolic (B=4.07, C1: 1.05, 7.1) blood pressure. Furthermore, weekly visits to fast food restaurants was associated with increases in systolic (B=3.11, C1: 0.19, 6.0) and diastolic (B=1.94, C1: 0.17, 3.70) pressure.
Pan et al. (2009)	5167 Canadian adult respondents of the Physical Activity Monitor, aged 15-79 years.	Physical activity (PA) based on the short form version of the International Physical Activity Questionnaire (IPAQ).		Self reported physical environment variables (number of places to safely walk, number of places to safely ride a bike, number of publicly owned multi- purpose recreation trails, number of facilities, place and programs designed for PA and sports, number of other places that could be used for PA). Social environmental variables (information for PA, health and well being; help in planning daily schedule; professional help for choosing best types of activities; convenient public transportation; affordable facilities, services and programs; affordable support services; affordable services to link with other people).	Age, gender, education level, marital status, employment status, number of children, household income, self rated health, intention, perceived health benefits, self efficacy.	Multiple logistic regression.	Self-efficacy and intention exhibited strongest positive correlations with PA. Family income, self-rated health and perceived barriers were also consistently associated with PA. The effects of the perceived health benefits, education and family income were more salient to older people, whereas the influence of education was more important to women and the influence of perceived barriers was more salient to women and younger people. Facility availability was more strongly associated with PA among people with a university degree than among people with a lower education level.
Sallis et al. (2009b)	A cross sectional sample of 2199 adult respondents of the Neighbourhood and Quality of Life Study (NQLS) from 32 neighbourhoods of Seattle-King County and Baltimore-Washington DC.	Daily minutes of moderate-to- vigorous physical activity (MVPA), body mass index, mental and physical quality of life (QoL) based on SF-12.	Census block group.	Neighbourhood walkability index based on net residential density, street connectivity, 6-category land use mix and retail floor area ratio. Neighbourhood income.	Age, gender, education, ethnicity, number of motor vehicles/adults in household, marital status, number of people in household, and years at current address.	Mixed effect regression modelling.	In the case of percent overweight/ obese, the walkability main effect was significant (p=0.007). With respect to the high walkable neighbourhoods, those living in low walkable neighbourhoods reported higher odds (OR=1.35, 95% CI: 1.09, 1.69). In the case of percent obese, the income main effect was significant (p=0.007). With respect to the high income neighbourhoods, those living in low income neighbourhoods, those neighbourhoods, but unassociated with walkability (p=0.006).

							Total MVPA was 5.8 minutes/day higher in high walkability neighbourhoods than the low walkable neighbourhoods (p=0.0002).
Sallis et al. (2009a)	Cross sectional sample of 11541 adults aged 18-65 years and residents of 11 countries (Belgium, Brazil, Canada, Columbia, China- Hong Kong, Japan, Lithuania, New Zealand, Norway, Sweden, and US) who participated in the International Physical Activity Prevalence Study (IPS).	Physical activity (International Physical Activity Questionnaire measured the frequency and duration of walking, and moderate-intensity and vigorous physical activity, for leisure, transportation, and occupational purposes; and of inactivity).	Area within a 10-15 minute walk from home.	Physical Activity Neighbourhood Environment Survey (PANES): Housing type, shops within neighbourhood, itransit stop within neighbourhood, sidewalks on streets, facilities to bicycle, access to low cost recreation facilities, crime rate.	Age, gender, educational attainment.	Logistic regression.	Physical activity prevalence was beneficially associated with presence of shops (OR=1.29, 95% CI=1.15, 1.44); access to transit stops (OR=1.32, 95% CI: 1.16, 1.54); presence of sidewalks (OR=1.47, 95% CI: 1.32, 1.65); bicycle facilities (OR=1.21, 95% CI: 1.10, 1.33); and access to low cost recreation facilities (OR=1.16, 95% CI: 1.05, 1.27).
Santana et al. (2009)	Cross sectional sample of 7669 individuals aged 18 and over from 143 neighbourhoods of Lisbon Metropolitan Area, Portugal.	Overweight and obesity (based on self reported body mass index, healthy diet, moderate and vigorous physical activity.	Administrative boundaries of the wards.	Environmental Opportunity (number of groceries, supermarkets, green parks, sports facilities, swimming pools post offices). Social capital (number of clubs for recreational or sports activities, local newspaper, local newspaper irculation/inhabitant). Diverse local resources (number of dental practices, banks, ATMs, shopping centres, opticians, sports shops, book shops). Public health services (number of nursery staff, public health doctors in Primary Care services, GP and family/1000 inhabitants). Unsafe environment (crimes, traffic accidents/1000 inhabitants).	Age, gender, marital status, educational level, economic activity, occupational class, self rated health, income, smoking. Housing inadequacy. Deprivation.	Multilevel logistic model.	Higher crimes against property were associated with higher BMI (OR=1.02, 95% CI: 1.01, 1.03), lesser healthy diet (OR=0.98, 95% CI: 0.98, 0.99) and moderate physical activity (OR=0.98, 95% CI: 0.97, 0.99). Density of public health services was beneficially associated with both weight outcomes (OR=0.84, 95% CI: 0.74, 0.95) as well as moderate physical activity (OR=1.38, 95% CI: 1.14, 1.66). Social cohesion was beneficially associated with both moderate (OR=1.28, 95% CI: 1.09, 1.52) as well as vigorous (OR=1.24, 95% CI: 1.01, 1.52) physical activity.
Black et al. (2010)	Cross sectional sample of 9916 non-institutionalized adults respondents of New York City Community Health Survey (CHS), New York City.	Obesity calculated from self reported body mass index (BMi≥30kg/m <sup>2</sup> ).	Based on United Hospital Fund geographic units used in 2005 Community Health Service (34 neighbourhoods in total).	Population adjusted (per 100000) availability of supermarkets, restaurants, emergency food providers, small grocer, fast food outlets, beverage and snacks stores, physical activity facilities, Percent of residential and commercial land use. Violent crime. Factor analysis based measures of neighbourhood amenities and neighbourhood vulnerability.	Age, gender, racial/ethnic identity, marital status, nativity, highest educational attainment, employment status, annual household income, and smoking status.	Multilevel Poisson regression.	Availability of large super markets (PR for z score=0.88, 95% CI: 0.84, 0.93), restaurants (PR for z score=0.87, 95% CI: 0.81, 0.93), fast food outlets (PR for z score=0.89, 95% CI: 0.84, 0.95), beverages and snack stores (PR for z score=0.88, 95% CI: 0.82, 0.93), fitness facilities (PR for z score=0.87, 95% CI: 0.81, 0.93), commercial land use (PR for z score=0.89, 95% CI: 0.83, 0.94) were all associated with reduced risks of obesity. Increased neighbourhood level income (PR for z score=0.89, 95% CI: 0.84, 0.95) was also associated with reduced risks of obesity. Higher residential land use was associated with neduced risks of obesity (PR=1.00; PR for z score=1.07, 95% CI: 1.01, 1.14). Neighbourhood amenities score was a significant predictor of obesity (PR for z

							score=0.85, 95% CI: 0.80, 0.91).
Gomez et al. (2010)	A cross sectional sample of 1886 older adults from 50 neighbourhoods of Bogotá, Columbia.	Physical activity (adapted version of International Physical Activity Questionnaire - Short Form.	Bogotá neighbourhood as defined by Major's Office. Built environment was measured within a 500- metre buffer around centroid of each neighbourhood.	GIS based objective measures: Number of Trans Milenio stations, presence/absence of <i>Ciclovia corridor</i> (a recreational strategy), public park density, street connectivity index, land use mix. Perception of built environment: Safety from traffic, satisfaction with quality and maintenance of sidewalks.	Age, gender, education level, years of residence in neighbourhood, limitation to engaging in physical activity, slope, and neighbourhood SES.	Multilevel modelling.	People residing in neighbourhoods with middle tertile of park density (4.53%–7.98% of land) were more likely to walk for at least 60 minutes during a usual week (prevalence OR [POR] =1.42, 95% C1:1.02, 1.98). Residents of areas with the highest connectivity index were less likely to report walking for at least 60 minutes (POR=0.64, 95% C1:0.44, 0.93). Participants who reported feeling safe or very safe from traffic were more likely to report walking for at least 60 minutes (POR=1.50, 95% C1:1.11, 2.03). The presence of Ciclovia was marginally associated with having walked at least 150 minutes in a usual week (POR=1.29, 95% C1: 0.97, 1.73).
Owen et al. (2010)	Cross sectional study involving a total of 2159 (aged 20-65 years) nested within 32 communities of Adelatde and 382 (18-65 years) residents from Ghent, respectively.	Bicycle use for transport – measured by International Physical Activity Questionnaire - Long Form.	10- to 15-min walk around the resident's home.	Adelaide study: Walkability index based on dwelling density, street connectivity, land use mix, and net retail area ratio Ghent study: 40-item questionnaire, which was a modified Dutch version of the Neighbourhoods Environment Walkability Scale instrument.	Age, gender, educational attainment, and working status as well as area level SES (for Adelaide study).	Logistic regression, multilevel logistic modelling.	Higher neighbourhoods walkability was associated with a higher likelihood of bicycle use for transport in Adelaide (OR=1.82, 95% Cl=1.24–2.66, p<0.01). Also, less bicycling with increasing age . In Ghent, those living in the higher and highest walkability neighbourhoods had approximately a 2.5 times higher likelihood of using bicycle for transport (OR=2.42-2.62, p=0.004) samples. Also, those who are working reported less bicycle use, compared to the non-working populations. Statistically significant associations for gender in both samples, with women having a lower likelihood of bicycle use compared to men.
Parra et al. (2010)	Cross sectional sample of 1863 older adults from 50 residential neighbourhoods of Bagota, Columbia.	Health related Quality of Life (HRQOL)employing the Short Form 8 (SF-8) instrument Self rated Health.	City neighbourhoods. All built environment (BE) variables were measured within a 0.5 km crow fly buffer around centroid of each neighbourhood.	Objective BE measures: public park density, number of Trans Milenio stations and presence/absence of <i>Ciclovia corridor</i> (a recreational strategy) Perceived BE measures: safety of parks, green spaces and public recreational spaces, safety from traffic, street noise levels Walking levels based on International Physical Activity Questionnaire.	Age, gender, neighbourhood SES, education level, time of residence in the neighbourhood, living alone and proximity to family members.	Hierarchical linear regression.	The physical dimension of HRQOL was negatively associated with perception of noise level ( $\beta$ =-1.75, p<0.001), while positively associated with perception of safety from traffic ( $\beta$ =3.02, p<0.001) as well as walking levels ( $\beta$ =9.50, p<0.001) as well as walking levels ( $\beta$ =9.50, p<0.001) as well as walking levels ( $\beta$ =9.50, p<0.002), was negatively associated with perception of noise level ( $\beta$ =-3.51, p=0.003), while positively associated with perception of safety from traffic ( $\beta$ =2.09, p=0.002), park safety ( $\beta$ =1.72, p=0.001) as well as walking levels ( $\beta$ =5.58, p<0.001 for 150 or more minutes/week). Self-rated health was beneficially associated with park safety (OR=1.40, 95%CI: 1.13-1.73), safety from traffic (OR=1.54, 95%CI: 1.25-1.89) and areas with more than 8% park coverage
							(OR=1.31, 95%Cl: 1.01-1.70).
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Pouliou & Elliott (2010b)	Cross sectional sample of 5,418,218 respondents aged 20 years and older from the Canadian Community Health Survey (CCHS) and living in metropolitan areas of Toronto and Vancouver, Canada.	Overweight/obesity (based on BMI).	1-km buffers, with distances based on the street network.	Built environment variables: land use mix, street connectivity, residential density, density of fast-food restaurants, density of convenience stores, density of grocery stores and supermarkets and density of recreational activities facilities. Walkability index (comprising of for the residential density, street network connectivity and land use mix variables).	Demographic variables: Age, gender, marital status, period of arrival in Canada, race/ethnicity Socio-economic variables: Income adequacy, employment status, home ownership, education level Health status: Chronic disease status, such as cardiovascular diseases, rheumatoid/arthritis and anxiety mood disorders Life style: Smoking status, drinking, and physical activity, fruits and vegetable consumption.	Stepwise multivariate linear regression.	BMI was significantly associated with age, sex, race, participants diagnosed with chronic conditions, education. Self-reported smoking status was found to be inversely associated with BMI. Residential density was also negatively associated with BMI for both Toronto ( $\beta$ = -0.0534, p<0.01) and Vancouver ( $\beta$ = -0.2997, p<0.05). Individuals living in areas with mixed land uses ( $\beta$ = -1.107, p=0.001) and higher street connectivity ( $\beta$ = -0.00494, p=-0.01) have lower BMI's only for Vancouver but the results were insignificant for Toronto. Individuals living in more walkable areas had lower BMI on average (0.04kg/m <sup>2</sup> for Toronto and 0.06kg/m <sup>2</sup> for Vancouver) than those living in the least walkable areas.
Sheu-jen et al. (2010)	Cross sectional sample of 523 primary school children, aged 11-12 years of 10 primary schools in urban and rural areas of Taipei City, Taiwan.	Physical activity assessed by: Modified Chinese version of Child/Adolescent Activity Log (CAAL). Questionnaire adapted from the short form of the International Physical Activity Questionnaire (IPAQ).		Modified-Neighborhood Environment Walkability Scale (NEWS): 11 component items measuring the aspects of aesthetics (4 items), convenience (4 items), and safety (3 items).	Gender, grade in school, monthly household income, educational level of head of school.	ANOVA, multiple regression.	No significant difference in walkability was found between the urban and rural areas. There was a significant difference in accessibility of places for physical activity between the urban and rural areas, with urban children reporting better accessibility. Total hours of physical activity was beneficially associated with accessibility ( $\beta=6.21$ , p=0.03). The urban children reported more physical activity ter school, on holidays and weekends, and also in total amount of physical activity compared with the rural children.
Troped et al. (2010)	Cross sectional sample of 148 adults aged 19-78 years from Massachusetts, USA.	Moderate-to-vigorous physical activity (MVPA); calculated as total, home, and office MVPA within a 50 m and 1 km home and work buffers. Respondents wore accelerometer and GPS unit.	1 Km street network buffer around the home and work locations	Intersection density (connectivity), land use mix, residential population density, housing unit density, greenness (based on NDVI index within buffer using Landsat ETM+ satellite image).	Age, gender, race/ ethnicity, education.	Multiple linear regression.	The study reported non-significant association between built environment variables and total MVPA. Significant positive associations were reported for intersection density ( $\beta$ =0.4337, p=0.0001, land use mix ( $\beta$ =0.4337, p=0.0001, lestilential population density ( $\beta$ =0.0001, p=0.0001, p=0.0001) within 1 km home buffer and MVPA in buffer; vegetation index was inversely associated with home MVPA ( $\beta$ =-5.3704, p<0.0001). Significant positive associations were reported for population density ( $\beta$ =0.0001, p=0.0001). Significant positive associations were reported for population density ( $\beta$ =0.00001, p=0.0004), housing unit density ( $\beta$ =0.00001, p=0.0004), housing unit density ( $\beta$ =0.00001, p=0.0006) within 1 density ( $\beta$ =0.00001, p=0.0006) within 1 density ( $\beta$ =0.0001, p=0.0006) within 1

Van Dyck et al. (2010)	Cross sectional sample of 1166 adult respondents of the Belgian Environmental Physical Activity Study (BEPAS) conducted in Ghent, Belgium.	Self-reported physical activity was collected using the long Dutch International Physical Activity Questionnaire, objectively assessed accelerometer measured physical activity.	Census statistical sector.	Neighbourhood walkability index based on residential density, intersection density, and 5-category land use mix. Neighbourhood SES based on annual household income data.	Age, gender, education, living situation, working situation, working status, and BMI.	Multilevel modelling.	Living in a high-walkable neighbourhood was beneficially associated with significantly more walking for transport ( $\beta$ =0.746, p<0.001), more cycling for transport ( $\beta$ =0.447, p<0.001), more recreational walking ( $\beta$ =0.334, p<0.01), and more accelerometer-based moderate to vigourous physical activity ( $\beta$ =0.095, p<0.001), but less motorized transport ( $\beta$ =0.125, p<0.05). Living in a high-SES neighbourhood was associated with significantly less walking for transport ( $\beta$ =0.260, p<0.05) and more motorized transport ( $\beta$ =0.215, p<0.05).
Wood et al. (2010)	Cross sectional sample of 609 participants drawn from the Strategies for Metropolitan Atlanta's Region Transportation and Air Quality (SMARTRAQ) study in 13 County metropolitan of Atlanta Region.	Six item composite measure of Sense of Community (SofC).	1 km road network buffer around each participant's household.	Objective measures of built environment (land use mix, connectivity, commercial FAR, net residential density). Perception of neighbourhood (see neighbours when walking, walkable shops and services, interesting sites, good sidewalks, safe street crossings, adequate street lighting, safety from traffic when walking, safe from crime when walking, no steep hills).	Age, gender, race, number of dependent children, educational level, household income, percent renting/owning home, length of residence, median income in neighbourhood, percent home ownership in neighbourhood, and self reported physical activity.	General linear model.	SofC was positively associated with leisurely walking (days/week) ( $\beta$ =0.329, p=0.000), home ownership ( $\beta$ =2.564, p=0.000), seeing neighbours when walking ( $\beta$ =0.682, p=0.000) and the presence of interesting sites ( $\beta$ =0.617, p=0.001). SofC was also beneficially associated with higher commercial floor space to land area ratios (FAR) ( $\beta$ =2.315-2.607, p=0.018-0.046). The presence of more mixed use (( $\beta$ =3.260, p=0.002 in reference to high land use mix) and perceptions of steep hills ( $\beta$ =-0.365, p=0.010) were inversely associated with SofC.
Yan et al. (2010)	Cross sectional sample of 350 high school students from the Baltimore Active Living Teens Study (BALTS) in Baltimore, Maryland.	Physical activity related environmental perceptions based on the Neighbourhood Environment Walkability Scale (NEWS).	Census tracts.	Neighbourhood form: Land use mix (diversity index. Herfindahl- Hirschman index, acreage of commercial land use) Density (tract population density, 3D- population density, housing unit) Street pattem and circulation system (internal connectivity, external connectivity, intersection density, distance to CBD, road density) Accessibility measures (commercial distance, commercial gravity, residential transit, commercial gravity, residential transit, commercial perception: Access, Traffic safety, Neighbourhood safety	Age, gender, race/ethnicity, grade in school.	Factor analysis and cluster analysis for classification neighbourhood types, multinomial logistic regression.	Four neighbourhood types: arterial development, inner city area, suburban residential and central business district were identified. Girls who lived in suburban residential areas were less likely than their central business district counterparts to perceive the facilitating effects of crosswalks (OR=0.44, 95% CI: 0.20, 0.94) and pedestrian traffic signals (OR=0.37, 95% CI: 0.18, 0.78). Girls living in inner-city neighbourhoods were more likely to perceive traffic as slow compared to central business district counterparts to perceptions of their neighbourhoods did not vary by neighbourhood types.
Burgoine et al. (2011)	Cross sectional sample of 893 individual participants of the Health Survey for England (HSE) dataset from North East of England.	Body mass index and fruit and vegetable intake.	Lower Super Output Area (LSOA).	Availability of food that is generally consumed outside of the home (pizza delivery and takeaway, takeaway and restau-rant) availability of food that is generally consumed within the home (supermarkets, greengrocers and	Age, sex, ethnicity, social class, urban/rural, index of multiple deprivation, perceived vandalism and access to shops.	Correlation, ANOVA and Chi-square and logistic regression.	A higher residential density was associated with increased odds of being overweight (OR= 2.704, 95% CI: 1.062, 6.885 for the highest quintile). None of the other walkability and food availability variable were significantly associated

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				street connectivity and land use mix.			with BMI and fruit and vegetable intake.
Saarloos et al. (2011)	Cross sectional sample of 5218 older adults drawn from the Health in Men Study (HIMS) from Perth Metropolitan Area.	Prevalence of depression assessed by the self rated 15 item Geriatric Depression Scale.	Census Collection District (CCD).	GIS based measures of street connectivity, residential density, land use mix, neighbourhood walkability (standardized from the preceding three variables) and land use availability expressed as in terms of presence absence of retail, other retail, business- offices, community services and recreation facilities.	Age, education, migrant status, smoking, Charlson comorbidity, living alone, housing type, Index of relative socio-economic disadvantage, Duke Social Support Index (DSSI), Family and Friends Adaptation, Partnership, Growth, Alfection, Resolve (APGAR) scale, sense of community,	Multivariate logistic regression	A higher land-use mix was independently associated with higher odds of depression independent (OR=1.54, 95% CI: 1.10=2.16, and OR=1.52, 95% CI: 1.08=2.14 for the second and third tertiles respectively). Also retail availability was associated with a 40% increase in the odds of depression (95% CI: 1.04–1.90).
Wolch et al. (2011)	Longitudinal (eight years) study of 3173 children aged 9-10 years from twelve communities of Southern California.	Body mass index.	0.5 km Euclidean buffer.	Park space in acres within a 0.5 km buffer and number of recreation programs within a 10 km buffer. Adjustments in the models were made for traffic density within 150 metre buffer, distance to nearest highway, population density, average urban imperviousness, average tree canopy within 0.5 km buffer, agricultural land use, number of "X" intersections, NDVI.	Age, ethnicity, town, gender, percent poverty in census block of home, forcible rape rate.	Multilevel growth curve model.	Access to both parklands ( $\beta$ = -0.1389, 95% CI: -0.032, -0.246) and recreational programs ( $\beta$ = -1.4429, 95% CI: -0.671, -2.215) were beneficially associated with BMI attained at the age of 18. Gender differences were notable but significant only for access to recreation.
Ball et al. (2012)	Cross sectional sample of 1062 respondents who participated in the Greater Glasgow Health Board (GGHB) Health and Well- Being Survey from 198 neighbourhoods of Glasgow, UK.	Body mass index.	Census defined Data Zones (DZ).	Index of street connectivity based on measures of direction density, intersection density (for 3 or more directions of travel), cul-de-sac density, street density, length density, Beta Index and Eta Index.	Age group, gender, socio- economic position and Scottish Index of Multiple Deprivation.	Linear multi level modelling.	No evidence of significant association between street connectivity and BMI and BMI category.

#### Audit tool Reference Objective No. of **Components variables** Reliability items covered Observational measure for Caughy et al. Assessment of the 17 Physical incivilities (presence of graffiti, poorly maintained resident buildings, A total of 1135 hundred blocks for the 57 resident grounds, moderate or significant litter, presence of vacant/burned urban neighbourhoods (2001)neighbourhood neighbourhoods in Baltimore City, USA were rated. characteristics relevant to residences and commercial establishments, poorly maintained public space). The neighbourhood level reliability for the scales of the studies of health and Territoriality (presence of Crime watch/security/no trespassing signs, physical incivilities, territoriality, and play resources Residents react to presence of raters, 1/3 or more of homes with was 0.96, 0.93, and 0.94 respectively. At the streetwell being of families and borders/hedges, security bars, decorations, visible sign denoting children level, the reliability of the physical incivilities was 0.74; however, the street-level reliability of the neighbourhood name). Availability of play resources (1/3 or more of homes with yards, public territoriality and play resources scales was low at playground in good condition, children visible playing, street not a busy 0.33 and 0.42 respectively. thoroughfare). Weich et al. 27 Built environment site survey Evaluation of the Housing form, no. of stories of buildings, type of access to dwellings, no. of Kappa coefficients were 0.5 for fifteen categorical dwellings per entrance, no. of dwellings in an housing area, age of housing, items and intra-class correlation coefficients checklist (BESSC) (2001) psychometric properties of a set of objective measures of no. of trees in public domain, nature of spaces outside dwellings, proportion of exceeded 0.6 for a further three continuous private gardens, proportion of balconies, shared recreational space, no. of the built environment measures. vehicular entrances, no. of pedestrian entrances, entrances visible from roads, footpaths; parking arrangements, no. of children play areas, footpaths overlooked, open spaces overlooked, disused buildings, derelict land, evidence of vandalism, evidence of graffiti, territorial functioning, neighbourhood watch signs. Neighbourhood Active Living Gauvin et al. Neighborhood-level 18 Activity friendliness (expressed in terms of limits of pedestrian system to Eight observers performed ratings of 112 Potential (NALP) pedestrian, efforts to walk around, limits of bicycle system to cyclists needs, neighbourhoods of Montreal, Canada. The average (2005)measurement of active living potential. efforts to cycle around, if the pedestrian system addresses pedestrian's and reliability indices across neighborhoods were 0.78, cyclist's needs). 0.76, and 0.83, for activity friendliness, safe, and Safety (degree of threat from traffic to pedestrians and cyclists, if feeling density of destinations, respectively. threatened with the potential for crime, if feeling comfortable with the potential for crime). Density of destinations (exclusiveness and inclusiveness of people, no, of people oriented destinations, environmental stimuli, socially dynamic/static, visual interest, variety of destinations, overwhelming). Systematic Pedestrian and Pikora et al. Measurement of the 35 Functional factors associated with: 16 observers assessed a total of 12,925 street segments in metropolitan Perth, Western Australia Cycling Environmental Scan (2002)physical environmental Walking/cycling surface - Path type, surface type, path maintenance, path (SPACES) factors that may influence continuity, route directness, path width, gradient 48 out of the 67 variables had excellent-fair interwalking and cycling in local Street - street width, vehicle parking, kerb type rater reliability (kappa ≥ 0.4), while 64 out of the 71 neighborhoods. Traffic - Volume, speed, traffic control devices variables had excellent-fair intra-rater reliability (kappa ≥ 0.4). Permeability: Street design, intersection distance & design, other access points Safety factors associated with Personal safety - Lighting, surveillance, path obstruction Traffic safety - Crossing, crossing aids, verge width, driveway cross-overs, lane marked, path/lane continuity Aesthetics factors associated with Streetscape - Trees, garden maintenance, maintenance, pollution, cleanliness, parks Views - Sights, architecture Destination factors associated with Facilities - Parks, shops, services, local facilities, vehicle parking, public

#### **Table 4.5.** Audit tools developed to study the built environmental correlates of physical activity and mental health.

				transport, bke parking Subjective assessment based on Attractiveness and Difficulty for Walking and Cycling.	
Walking Suitability Assessment Form Bicycling Suitability Assessment Form	Emery et al. (2003)	Assessment of the suitability of sidewalks for walking and roads for bicycling.	15 27	<ul> <li>Walking Suitability Assessment Form comprised of: Continuous items (annual average daily traffic, posted speed, Number thru lanes, sidewalk presence, sidewalk condition, sidewalk width, sidewalk material, buffer width, curb ramps, adequate lighting, isolated problem spots) Categorical items (if any busy intersections need -&gt; marked cross walks, traffic signal lights, pedestrian walk signals; if any wide intersections need refuge island for safer crossing).</li> <li>Bicycling Suitability Assessment Form comprised of: General road factors (annual average daily traffic, number of through lanes, speed, outside lane width, bike lane width).</li> <li>Pavement factors (pavement condition, presence of curb and gutter, rough railroad crossing, storm drain grate).</li> <li>Location factors (angle parking, parallel parking, right-only turn lanes, center (both) turn lane, physical median, paved shoulder, marked bike lane, severe grades, moderate grades, frequent curves, restricted sight distance, numerous driveways, numerous intersections, difficult intersections, commercial land use, industrial land use, sidewalk only one side, sidewalks don't exist).</li> </ul>	Intra-class reliability correlations for the walking and bicycling assessment instruments were $r = 0.79$ and .90, respectively. Inter-coder reliability of the experts' Likert response system was $r = 0.73$ for the walking form and $r = 0.77$ for the bicycling form.
Neighborhood Environment Walkability Scale (NEWS)	Saelens et al. (2003a)	Assessment of neighborhood environment characteristics hypothesized to be related to physical activity.	8	Residential density Proximity to, and ease of access to, nonresidential Land uses, such as restaurants and retail stores (land use mix–diversity and land use mix–access) Street connectivity; Walking/cycling facilities, such as sidewalks and pedestrian/bike trails Aesthetics Traffic safety Crime safety.	Intraclass correlations for the test–retest reliability of the NEWS subscales were all ≥.58, and the majority of test–retest values were ≥.75.
Walkable Places Survey (WPS)	Shriver (2003)	Enables common people to assimilate site-specific physical and perceptual data evaluations for collaborative community based neighbourhood planning.	30	30 streetscape characteristics all scored on a three-point Likert scale Traffic and parking: traffic speeds, noise/fumes, driver behaviour, parking Buildings & land use: signs, visual interest, building setback, sidewalk building links, occupancy, convenience Sidewalks: gaps/rips, width, curb, utilities Trees & greens: Buffers, bushes/grounds, trees Amenities & comforts: Seating, transit shelter, lighting, info/maps, public art Intersections: Crosswalks, curb ramps, road width, curb radius Perceptual: Eyes on street, enclosure, well-being.	Evaluation was conducted along a 10-block length of Baltimore Avenue in West Philadelphia, PA. WPS was primarily designed to be implemented by laypeople with a view to foster community based neighbourhood planning.
Self-reported questionnaire instrument	Echeverria et al. (2004)	Assessment of self-reported measures of the neighbourhood environment of possible relevance to cardiovascular disease.	6 scales of 36 items and 4 indices	Six scales: Aesthetic quality scale (7 items) walking/exercise environment scale (11 items) access to healthy foods scale (6 items) Social cohesion scale (5 items) safety from crime scale (3 items) Violence scale (4 items) Four indices: Presence and quality of recreational facilities (2 recreational facilities indices) Participation in neighborhood activities (neighborhood participation index) Potentially stressful neighborhood problems (neighborhood problems index).	The study comprised of a face-to-face and telephone interview administered twice to 48 largely Latino and African American study sample recruited from a public hospital setting in New York City. Cronbach's ar ranged from .77 to .94 for the scales corresponding to these domains, with test-retest correlations ranging from 0.78 to 0.91. Test-retest reliability measures for neighborhood indices of presence of recreational facilities, quality of recreational facilities, neighborhood participation, and neighborhood problems ranged from 0.73 to 0.91.

Senior Walking Environmental Assessment Tool (SWEAT)	Cunningham et al. (2005)	Assessment of the effects of the physical environment on walking among seniors.	188	Functionality: Structural aspects of the environment, including types of buildings (32 items), sidewalks (48 items), and buffer zone/street life (54 items). Aesthetics: Quality and visual appeal of the surroundings (12 items). Destination: Availability of services, transportation, and parking in the neighbourhood (12 items). Safety: Personal safety (24 items), traffic safety (6 items).	36 neighborhood segments in the city of Portland, Oregon were randomly selected and analyzed for inter-rater reliability. The raters had acceptable agreement for 67% of the items. Almost 80% of the sidewalk and street life items were reliable while, items assessing buildings and destinations were also less reliable than other categories (44% and 42% of items reliable, respectively).
Residential Environment Assessment Tool (REAT)	Dunstan et al. (2005)	Assessment of the physical conditions of neighbourhood and residential environment	28	28 items index with five sub-indices comprising of: Physical incivilities (broken/boarded up windows, vandalism to public and private property, abandoned cars, stray roaming dogs, illegal parking, burnt out properties, dog litter in street, littered pathway/street. Territorial functioning (low external beautification, poor garden and property maintenance, absence of neighbourhood watch signs). Defensible space (low defensible space, property density) Natural environment (few trees in front garden, predominant outlook green, no trees in public space, no planted vegetation, no green space) Miscellaneous (absence of recreational space, poor path condition, vacant properties, presence of derelict land, undesirable parking, poorly maintained shared areas, industrial outlook, commercial outlook).	The REAT score ranged from 0-68. Four raters worked in pairs to survey the 51 postcode units of Neath Port Talbot, South Wales, UK. Inter-rater reliability was assessed for individual items and also for the total REAT score indicated a lowest kappa of 0.58 for the condition of the paths, while the maintenance of shared space had a kappa of 0.67. Kappa values for the density of housing and maintenance of houses were between 0.7 and 0.8. Intra-class correlations were all greater than 0.9.
Irvine-Minnesota Inventory	Day et al. (2006)	Measure the wide range of built environment features that are potentially linked to active living, especially walking.	162	Items were associated with the four domains as: Accessibility (62 items); Pleasurability (56 items); Perceived safety from traffic (31 items); and Perceived safety from crime (15 items)	University of California–Irvine study: 76.8% of the variables had > 80% agreement among the three raters. University of Minnesota study: 99.2% of the variables had > 80% agreement among the two raters.
RESIDential Environment project (RESIDE)	Giles-Corti et al. (2006)	Design of Neighborhood Physical Activity Questionnaire (NPAQ) to differentiate and measure recreational- and transport- related walking undertaken within and outside the neighborhood and to provide an overall index of physical activity behaviour.		A list of behavior-specific destinations was provided. Transport-related walking destinations included work, public transport, shops or caté. Recreation related walking destinations included parks, the beach, walking trails/paths, cafes or sidewalks. Participants ticked the main destinations used for walking and recorded the frequency and duration (total min on each occasion) of walks to each destination.	The study was comprised over 82 participants, aged 20–71 years in Western Australia. Neighbourhood Physical Activity Questionnaire (NPAQ) was reported to be reliable for studies examining environmental correlates of walking within the neighbourhood (reliability of recall of whether participants had walked within neighbourhood; kappa = 0.84 and outside the neighbourhood (kappa =0.73).
Pedestrian Environmental Data Scan (PEDS)	Clifton et al. (2007)	Assessment of a range of micro-scale elements of the built and natural environment that predicts pedestrian movement.	40 questions, 83 measures	Segment type (low volume/high volume/bike-pedestrian path). Environment (land uses in the segment, slope, cul-de-sacs/dead ends in the segment). Pedestrian facility (type, path material, path obstructions, buffers between road and path, side walk continuity/completeness, sidewalk connectivity, sidewalk condition and maintenance). Road attributes (condition, number of lanes, posted speed limit, on-street parking, off-street parking lot spaces, whether walk through the parking lots to most buildings, driveways, traffic control devices, curb cuts in the segment, presence of crossing aids). Walking/cycling environment (lighting, amenities, way finding aids, number of trees shading walk areas, degree of enclosure, power lines along segment, cleanliness, articulation in building design, building setbacks from streets, bicycle lane, transit facilities).	A total of 71.5 miles of street and pedestrian pathways, equal to 995 segments in the city of College Park, MD, USA were surveyed. The rater- reliability testing showed that only a small number of items in the audit consistently garnered Kappa scores below 0.40. These were mainly the questions involving more subjective assessment or more abstract concepts, like amount of street lighting, articulation of building designs and degree of enclosure. On the other hand, many items (such as land uses, traffic control features, and presence of sidewalk) in the audit received very high Kappa scores (0.75 or above).

Scottish Walkability Assessment Tool - SWAT (builds upon SPACES tool to suit Northern European conditions)	Millington et al. (2009)	Objective record of the aspects of physical environment that promotes walkability in urban Scotland.	112	<ul> <li>37 Destination items –Parks (2); Parking (10); Services (18); Public transport (7).</li> <li>25 Safety items – Personal safety (8); Road safety (17).</li> <li>30 Aesthetics items – Street scape (20); Architecture (3); Views (7).</li> <li>20 Functional items – Walking surface (16); Permeability (4).</li> </ul>	Eighteen items showed good inter- and intra-rater reliability showing adequate variability (0.4≤ kapp <0.7); namely 5 destination items (3 parking and 2 services), 2 safety items (both traffic safety items), 7 aesthetics items (4 streetscape, 2 architecture and 1 views items), and 4 functional items (3 walking surface and 1 permeability items). 25 items proved unreliable, and 69 items lacked adequate environmental variability.
Montréal Neighbourhood Assessment Tool (MoNAT)	Paquet et al. (2010)	Assessment of the structural and contextual environmental characteristics of urban neighbourhoods related to urban form, negative attributes, especially social disorder and negative physical attributes, and positive physical attributes.	44	Physical characteristics/condition of streets and throughways (14 items) Negative physical characteristics/condition of public spaces (9 items) Positive physical characteristics/condition of public spaces (8 items) Physical characteristics/condition of dwelling units (13 items).	Two trained evaluators rated the condition of streets, public spaces, dwelling units and the presence/absence of specific characteristics of 250 street blocks within 30 socio-economically diverse census tracts of the Montreal Metropolitan Census Area in 2003. Inter- and intra-rater reliability was excellent (Kappa > 0.80) for items pertaining to urban form, and substantial (kappa > 0.60) for domains pertaining to positive and negative characteristics. Internal consistency was acceptable (Cronbach's alpha > 0.70) for urban form and negative characteristics, but not for positive characteristics.

# Chapter 5: <u>spatial Design Network Analysis</u> for <u>Urban Health</u> (sDNA-UH): A framework for evidence-based healthy-city planning, design and policy-making

# 5.1 Urban configuration, accessibility and health behaviour

The relationship between structure of configured urban space in a city and human behaviour has long been established in architecture and urban design scholarship. In his seminal work on environmental cognition Lynch articulated that the cognitive maps with which people perceive and navigate through urban space depend on the legibility of the city structure (Lynch, 1960). He proposed that cognitive maps of urban settings comprise a set of five basic types: paths, path intersections (nodes), landmarks, districts and boundaries (edges). Paths form the predominant element in urban morphology and may include channels along which individuals move and may be in the form of roads, walkways, transit lines, canals and railroads. Districts act as distinct internally homogeneous sub-sections or neighbourhoods which an individual is "inside of". Edges constitute boundaries between two phases representing breaks in continuity for example shores, railroad cuts, boundary between two districts etc. Paths connect within and between districts, while, nodes are strategic points acting as destinations and landmarks as points of references. Norberg-Schulz proposed a similar topological schema. The relationship between human functioning and perception psychology within an urban space were conceptualized to evolve as a result of the three intrinsic sensations of centres or place (proximity), directions or paths (continuity) and areas or domains (enclosure) (Norberg-Schulz, 1971). Another study reported an association between route angularity and spatial orientation of pedestrians, with oblique routes producing more disorienting effects than linear ones (Montello, 1991). More recently, Hillier proposed a formal

mathematical relationship between urban spatial configuration and social processes (Hillier and Hansen, 1984, Hillier et al., 1993, Hillier, 1996). He reasoned that urban space evolves intelligibly with an inherent social logic; continuous urban space (buildings and street networks) is configured in to a set of discrete interconnected units (sub-spaces). According to him, these sub-spaces may be classified in to three typologies: linear space in the form of street segments through which people move, convex space comprising squares and public spaces through which they interacts and the ever changing visual field through which they perceive the surroundings. It is primarily the boundaries, *physical connectivity* and *accessibility* between these sub-spaces that govern individual's mental and behavioural responses and social interactions within them. Thus, the environmental psychology of a place is defined by the physical structure of configured urban space, which in turn governs how people perceive, and are likely to move about within it. How they move about, in turn, has a fundamental impact on an urban economy, on urban society and on urban health.

Thus, one of the primary emergent paradigms in the study of contextual health variations has been the influence of *accessibility to health-promoting-community-resources* upon an individual's health. Accessibility in an urban activity space may be defined as the relative ease with which goods, services, activities and generally, 'destinations' or 'opportunities' can be reached from a given origin, essentially the dwelling location of an individual (Litman, 2003). Handy and Niemeier (1997) define accessibility to be a function of the spatial distribution of potential destinations, the ease of reaching each destination, and the magnitude, quality, and character of the activities found there and quantified in terms of travel costs, travel choice and destination choice. Koenig (1980) describes two major components of accessibility; a transportation element and an activity element. The transportation element is the resistance or impedance, i.e. role played by the characteristic topology of the urban route network in facilitating or inhibiting travel between two points in space, measured in terms of travel distance, time, or cost. The activity

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element indicates the spatial distribution of activities in the given urban space; in other words reflecting the existing land use pattern. It is often termed as the 'attractiveness' of a particular location or as a trip destination. The importance of accessibility in health research stems from the spatial logic that the impedance of distance shapes mobility and individual spatial behaviour through the urban space. Both the distance to health-promoting-community-resources as well as the spatial distribution of these offers life style choices and influences individual activity behaviours (Knox, 1982). As the studies reviewed in Chapter 4 show, it is now well established that the configuration of urban space, namely the land use and street network configuration shapes physical accessibility and seems thereby to have influence on health.

Several studies have highlighted the associations between health and access to healthpromoting community resources including: green spaces and recreational facilities (Norman et al., 2006, Diez Roux et al., 2007, Wolch et al., 2011, Nielsen and Hansen, 2007, Björk et al., 2008); transit stops (Edwards, 2008, Bassett Jr et al., 2008, Brown and Werner, 2008); supermarkets (Black et al., 2010, Inagami et al., 2006, Morland et al., 2006); sports facilities (Rutt and Coleman, 2005, Giles-Corti et al., 2003); community services (Field et al., 2004, Pearce et al., 2006); and health care facilities (Lovett et al., 2002, Luo and Wang, 2003).

Sarkar, Gallacher and Webster (2013a, 2013b) and Ball et al. (2012) considered the effects of street network configuration. Some studies have also highlighted the inhibitory health effects of specific land uses such as the density of alcohol outlets (Fone et al., 2012). Fone et al. place this within a network accessibility model. As well as affecting access to specific health-promoting or detracting destinations, street network configuration, it is hypothesized, has intrinsic qualities that affect individual health through making walking more or less attractive. This relates both to environmental psychology theory such as that already discussed and to urban economic theory. Webster (2010)

discusses the distinction between specific and general accessibility in the creation and intra-city distribution of urban agglomeration benefits.

Building upon these notions of accessibility in urban space, this chapter describes a novel methodology for testing and monitoring accessibility-health associations. It is a GIS database of high resolution built environment morphometrics constructed through a series of spatial network analysis techniques. I refer to it for convenience as *spatial Design Network Analysis for Urban Health (sDNA-UH)*. sDNA-UH has been operationalized the Caerphilly assembly constituency, South Wales, UK with an objective to construct detailed data for built environment - health epidemiological models for the population cohorts of a long standing and internationally prominent panel cohort study of adult men: the Caerphilly Prospective Study (CaPS). The use of a GIS framework enables the linking of data from diverse sources as well as performing extensive spatial analyses and queries with respect to the specific attributes of the built environment. More than 100 broad categories of objectively measured built environmental morphological metrices (morphometrics) were captured. Spatial analysis, data integration and compilation were performed in ArcGIS 10.0.

# 5.2 Methods

### 5.2.1 Health data source

The Caerphilly Prospective Study (CaPS), initiated in 1979-83 with the objective to study the aetiology of heart disease in adult men provided the source of health data for this research (Elwood, 1984, SSC&M University of Bristol., 2007). This population based male cohort has subsequently been used as an epidemiological laboratory for studying the various parameters of health in older adults with the progression of age. Briefly, the initial wave of the study comprised a cohort of 2512 men aged 45–59 years. Their health was followed up in four subsequent waves: phase II, 1984-1988; phase III, 1989-1993; phase IV, 1993-1997; and phase V, 2002-2004. My research employed living members of CaPS

who had participated in the 3<sup>rd</sup>, 4<sup>th</sup> and 5<sup>th</sup> examinations and resided within the study area. The geographical extent of the study covered the Assembly constituency of Caerphilly, South Wales, spreading across 114.54 square kilometres (see Figure 7.1, page 287 for the extent of the study area). The third examination was employed as a baseline, while the latest follow-up comprised 1225 surviving men aged 65-84 years. The maximum follow-up period was 13.9 years with an average of 11.7±1.0 (standard deviation) years. In each phase, the respondents answered a series of self-completion questionnaires on health, lifestyle and socio-demographic variables. Furthermore, the individual respondents attended a clinic, where they completed another set of questionnaires that included a psychiatric health section to measure mental health indices based on GHQ-30 (General Health Questionnaire) and HADS (Hospital Anxiety and Depression) scales as well as a section on cognition and memory. Physiological data were collected through an extensive clinical examination including anthropometry, blood pressure assessment and an electrocardiogram, and donation a fasting blood sample. The respondents gave their written consent at the time of recruitment and the research protocol for phase III was approved by Cardiff Local Research Ethics Committee, with the protocols for phases IV and V being approved by the Gwent Research Ethics Committee.

#### 5.2.2 Built environment data source

The UK Ordnance Survey Mastermap (OSM) data layers; the topographic layer, integrated transportation network layer (ITN) and address layer 2 of Caerphilly formed the basis for the construction of a set of built environment morphometrics. The OSM topographic layer contains information on detailed surface features of the landscape categorized under nine themes (buildings, roads, tracks and paths, rail, water, terrain and height, heritage and antiques, structures and administrative boundaries). The OSM address layer 2 provides the geo-referenced grid coordinates and the land use classifications for each and every Royal Mail address points, surveyed with a spatial accuracy of less than 1 metre. The OSM topographic layer and address layer 2 were

cleaned and the buildings and dwellings tables extracted. These tables enabled us to calculate the number of dwellings per building, the Royal Mail address and the OSM land use classes contained within each building unit. Data on transit stops (bus stops) was obtained from the Caerphilly Borough Council. A land use GIS of Caerphilly was extracted containing detail of each and every building in the topographic layer. I used the same land use classification as used by the Ordnance Survey (Ordnance Survey UK., 2011). The OSM ITN layer provides a topologically structured representation of the road network with respect to geometry of road links, road type (expressed in terms of motorway, A road, alleyway etc.), junctions, grade separation, road names and numbers and information about the nature of road the link represents (for example, single carriageway, dual carriageway or slip road). Geometric information comprises length of the link as well as references to the node features at ends of it. In the present study, as a first step, the three layers of the OSM were linked together using a unique id known as the *topo id* (see Figure 5.1). The OSM ITN layer was subjected to network analysis techniques to evaluate the topological accessibility indices of the street network.

# 5.3 Built environment morphometrics of sDNA-UH

The built environment was measured within a pre-defined street network buffer around an individual respondent's dwelling unit. Four buffer distances of 0.5 mile, 0.8 mile (ie. 1 kilometre), 1 mile and 1.5 miles were employed in the study for testing the effect of various health outcomes. A series of four sets of built environment morphometrics were constructed and were integrated within a GIS on the basis of the typological framework proposed by Lynch. Thus, each variable fell within one of the typologies of paths, nodes, edges, and districts, while landmarks were excluded from the study as the focus was solely on objective measurements of built environment rather than on individual's perceptual information. The detailed architecture of SDNA-UH is shown in Figure 5.2.



Figure 5.1. Linking of the three layers of UK Ordnance Survey data (derived from UK Ordnance Survey data of Caerphilly).





Figure 5.2b. Morphological metrics (morphometrics) of spatial Design Network Analysis for Urban Health (sDNA-UH).

# 5.3.1 Land use morphometrics

# Land use mix

Land use mix reflects the degree of heterogeneity of land uses within the defined buffers. It is usually measured with an indicator that ranges from zero to one, with zero representing a homogeneous, single land use environment and one representing a perfectly heterogeneous neighbourhood comprising of all possible permutations and combinations of land use categories. Heterogeneity (entropy) is usually synonymous with smaller trip lengths, fewer car trips and hence more walking, while homogeneity is assumed to be associated with more travel, especially car-born travel and is a feature of a health-inhibiting environment (as illustrated in Figure 5.3).



# Figure 5.3. Concept of land use mix

- a) Higher mixed land use is characterized by the presence of heterogeneous destinations and tends to minimize trip length, thereby promoting a walkable community
- b) Reduced land use mix represent a zoned community with longer trip lengths and hence more car-dependant.

In the present study, a five-category land-use mix score comprising residential dwellings, retail, community services, business and offices and recreation and leisure was operationalized using a method proposed by (Frank et al., 2004, Frank et al., 2006) as per the following formulae:

$$LUM = \left[\frac{\sum_{k=1}^{n} (p_k.ln p_k)}{ln N}\right]$$

where p is the proportion of land area occupied by a specific land use category k and N is the number of land uses.

#### Land use density

In section 4.3.1 of Chapter 4, I summarised studies that have found a relationship between land use density and health. A building GIS table was generated from the OSM topographic layer and each building unit within the study area were classified in to one of the OS land use classes from address layer 2. Overall, the following categories of land uses for were used in the study: single family dwellings, multi-family dwellings, residential dwellings, non-residential dwellings, retail, community services, business & offices, and recreation & leisure were considered. The densities of walkable community service destinations; bus stops, retail, churches, community services, and recreation and leisure amenities as well as business and offices were also measured within each defined buffers of a respondent's dwelling unit.

## 5.3.2 Health specific destination accessibility

In section 4.3.3 of Chapter 4, I have summarised the impact of specific health-enhancing facilities. Walkable destinations having the propensity to influence health in a specific way were parameterized in the study area in the form of network distance from a respondent's dwelling to the nearest green space, facility for physical activity, and healthcare facility, supermarket, takeaway and allotment garden. Network proximity was used as opposed to the conventional Euclidean/airline distance as it provides a more accurate behavioural measurement of accessibility. Street network distance (in meters) was calculated using 'closest facility analysis' in Network Analyst, ArcGIS 10.0. For larger destinations occupying a significant area such as green space, allotments, sports facilities, the intersection of the street network with the outer boundary was considered as the point of

access while, for other building destinations, a single point was employed as the location of the facility. The network analysis conducted for calculating proximity to nearest healthcare facility is shown in Figure 5.4.



**Figure 5.4.** Analysis of network proximity to nearest healthcare service. © Crown copyright database. Modelled from UK Ordnance Survey supplied ITN layer.

# 5.3.3 Street network accessibility

A city's route network defines the evolved and evolving urban form. It shapes the anthropogenic processes affecting an individual's activity patterns and its attributes are therefore likely to capture something important about the impacts of multi-scale urbanization upon individual health, which collectively builds up to public health. The human movement patterns are not merely random; rather, are planned comprising of multiple steps based on individual's spatial cognition. In an urban space, the individual's cognition may be governed by two components:

- a) The location of destinations from a given origin, generally an individual's residence
- b) The configuration of the intervening spaces that must be traversed to move to and fro from the origin to the destinations

Consequently, in addition to land use accessibility expressed in terms of density, mix, and physical distance to destinations, street network accessibility was included as the second component of accessibility on account of its significant potential in influencing activity behaviours and health. This allows us to test the independent association between health and, respectively, special and general accessibility.

Most studies looking at street network effects as part of a model of health have been vague, often, parameterizing network characteristics in terms of the number of 3-4-way street intersections within a defined buffer or per unit length of street. Although they capture some measure of route directness by doing this, nonetheless, they fail to capture more sophisticated and potentially more important behavioural information about connectivity and the interaction effects of land uses (destinations) adjoining the street network. Furthermore, in any systematic study of the effects of such network attributes, the spatial scale of the effects needs to be examined. This has hardly been covered at all in the spatial-epidemiology literature.

In this respect, the pertinent questions in the public health context are: a) do spatial network attributes at the levels of household, surrounding community, city, as well as the overall region as a whole, have any impact upon an individual's health?; b) how do we analytically capture them in order to study the nature of potential correlations?

To my present knowledge, the series of models mentioned in the subsequent Chapters 6-8 of this thesis conducts the simultaneous analysis of the effects of land use and street network based systemic multi-scale accessibility and movement potential upon individual

health outcomes, in all probability for the first time ever (Sarkar, Gallacher and Webster, 2013a, 2013b).

Network analysis of urban streets has a long tradition of being employed in the field of transport geography and land use planning. In the recent years several terms such as 'proximity', 'connectivity', 'integration', 'choice', 'cost', 'effort' etc. have emerged with a view to highlight the basic tenet that some urban spaces are more important than others on account of their being more *accessible*. Most of these network analysis techniques are driven by simple and tested, yet computationally demanding mathematical algorithms which owe their origins to *graph theory* (Freeman, 1977, Hillier, 1999, Porta et al., 2006, Crucitti et al., 2006b). The associations between spatial urban morphology and the social phenomena dependant on it are essentially captured by indices of relationality in the graphs. The notion of accessibility captured by these measures acts to formally elucidate how network morphology influences individual activity behaviours and drives various socio-economic processes.

In this thesis, I have employed the network analysis concept known as *space syntax* to assess street network accessibility. The epistemological framework of space syntax originated from the seminal works of Bill Hillier and Julienne Hanson of the University College, London; with an aim to delve deeper in to the intricacies of the urbanization of cities like London. It eventually evolved into a well developed and widely adopted set of analytical techniques to represent, quantify and analyze the spatial configuration of cityscapes and building space. The principal driving objective behind space syntax research has been to explain the nature of spatial configuration of urban spaces that evolve as a result of two simultaneous and interactive processes: (a) transformation of the physical urban form comprising the network of routes and adjoining land uses; and (b) the anthropogenic social interactions that give rise to and are supported by the urban form. There is a specific theory about these interacting evolutionary processes that gave rise to the initial space syntax model that puts emphasis on the perception of space and

particularly, the unhindered lines-of-visual-sight (Hillier et al., 1983, Hillier and Hansen, 1984, Hillier, 1996). The model can be abstracted from the specific theory, however and is consistent with a variety of urban economic behavioural propositions variously based on effort-minimisation (Webster, 2010). It is also consistent, as I have noted already, with key ideas from environmental psychology. The essential idea is that the topology as well as geometry of a system of interconnected urban spaces determines movement patterns and thus land use (and land value); and that the patterns created by the interrelationships between spaces are predictive of the kind of use made of different parts of a city. At the same time, those patterns are themselves determined by individuals interacting within the constraints of pre-existing morphological configurations. Global (in the sense of urban-systemic) organizational processes tend to generate mechanisms that ultimately shape the micro-level of patterns of movement within spaces.

In recent years, space syntax based measures of syntactic accessibility and movement potential of street segments have been shown to correlate well with many social phenomena. It has been employed in studies of pedestrian behaviour (Hillier et al., 1993, Raford and Ragland, 2004); studies related to walkability and physical activity in neighbourhoods (Baran et al., 2008, Cutumisu and Spence, 2009); cyclist route choice (Radford et al., 2007, McCahill and Garrick, 2008); geographies of crime (Hillier, 2004); social segregation (Vaughan, 2007); real estate value (Matthews and Turnbull, 2007, Chiaradia, 2009); city planning and urban design (Hillier and Hansen, 1984, Hillier, 1996, Peponis et al., 1997, Karimi et al., 2007, Volchenkov and Blanchard, 2008, Önder and Gigi, 2010, Chiaradia et al., 2012a, Karimi, 2012); and land grading, land pricing and rent evaluations (Zhao et al., 2007, Enström and Netzell, 2008). At an architectural scale (from where the method originated), the same measures have been employed to generate housing genotypes (Hillier et al., 1987, Bandyopadhyay and Merchant, 2006); and to devise innovative designs of buildings based on perception psychology of way-finding and movement tracing (Ortega-Andeane et al., 2005, Li and Klippel, 2010).

In this thesis, two space syntax modelling techniques described below have been employed in the assessment of the impact of street network configurations upon individual health outcomes.

#### Space syntax modelling technique: Angular segment analysis (ASA)

As other network analysis models, space syntax is operationalized through a set of basic indices from graph theory applied to spatial relationality. In order to replicate the linear pattern in which we tend to move, the entire urban space is broken up into a series of components; namely convex spaces (such as public spaces, green spaces) and longest axial lines corresponding to streets, boulevards, avenues, alleys and so on. In space syntax methodology, a so-called *axial map* of the urban space is extracted; the axial map comprising the fewest and longest set of lines representing uninterrupted movement and/or visibility.

In the conventional space syntax analysis modelling paradigm, the model of street segments represented by the axial map is first transcribed into an access graph comprising a set of nodes representing the street segments and edges representing their intersections. The access graph captures the essential topological properties of the built environment. The access graph is then transformed in to a justified graph, wherein a node of the access graph is identified as the *root* for the analysis and the rest of the nodes in the graph are ordered into a hierarchic relative to the root (in the example indicated in Figure 5.5, the origin of segment A). In a way the justified graph drawn from a particular root pulls the configuration close to it if the segment is highly integrated. On the contrary segregated spaces push the reminder of the configuration away from the root. The hierarchical levels indicate the number of angular steps needed to be traversed to pass from the location of a specific node to the root of the graph. Most of the traditional indices of space syntax were based on the notion of metric distance and revolved around the calculation of mean depth from a justified graph of the configuration, calculated within a predefined catchment area (expressed as the number of steps away from the root of the

graph). The total number of spaces at each level of depth is multiplied by the value of the level and added up to arrive at the total depth. Thus,

$$Mean metric depth = \frac{Total depth}{(k-1)}$$

where k is the total number of nodes in the graph including the root. The root is considered to be at level 0. This has been illustrated in Figure 5.5.



Figure 5.5a. Configuration of street segments represented by an access graph.5.5b. Justified graph derived from the configuration with depths and mean depth indicated (the root of the graph is the origin of the segment A).

Hillier and lida (2005) argued that distance costs between two adjacent segments in a disaggregated line-network model may be governed by three potential definitions, namely;

 Least length (pertaining to least Euclidean distance): The distance cost may be measured as the sum of segment lengths which represent the Euclidean distance between the mid-points of two adjacent segments

- Fewest turns (pertaining least topological distance): The distance cost may be measured in terms of the total number of changes of direction that have taken place along a route
- Least angle change (pertaining to least geometric distance): Wherein the distance cost may be measured as the sum of angular changes that are made along a route. A weight can be assigned to each intersection which is proportional to the angle of incidence of the two line segments at the intersection.

Research evidence suggests that although Euclidean distance is an obvious factor, but that this is nonetheless dependent upon the psychology of navigation choices of individual movers. Hillier and lida (2005) termed the geometrical and topological properties of the network as *'network effects'* and through their empirical studies on London concluded that performing geometrical analysis within a metric catchment area (radius) is the most powerful approach to capturing the mixed effects of these different kinds of impedance factors. The different impedances illustrated in Figure 5.6a-b. In 5.6a, although the route AB represents the shortest metric path, yet it is also the one associated with higher geometric and topological costs. On the contrary in Figure 5.6b, the route AB is associated with comparatively lower angular costs and hence, more likely to be taken. The approach followed comprises of measuring geometry and topology impedance within Euclidean-defined radius (to subordinate them to metric distance as a dominant behavioural influence).



- Figure 5.6. Two different street network configurations.5.6a. Route section AB associated with least metric costs and higher geometric and topological costs
  - **5.6b.** Route section AB associated with least angular costs.

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Turner (2000) introduced a space syntax modelling technique called angular segment analysis wherein, he substituted the notion of least metric length (expressed in terms of Euclidean distance between the two centroids of a pair of adjacent line segments) for the angular depth between them. In simple terms, the angular depth between adjacent axial lines is simply a function of the aggregate turning angle in radian. The axial lines in an axial map are first broken into segments. Thereafter, the sum of the angles turned from the starting segment to any other segment within the system is recorded. This angular sum represents the 'cost' of a putative journey through the graph. The algorithm thus evaluates shortest angular distance (a measure of least cost) from one segment to another in the system.

Behaviourally, these graphical accessibility indices are based on two trip-choice criteria that an individual has to make while traversing through the urban space:

- a) Selecting a destination This is based on how easy is it to get to a destination, also termed as the *to-movement* component. The driving hypothesis is that more accessible destinations are more likely to be selected as locations for higher activity uses, such as shops, because they are easy to get to.
- b) Selecting a route to get to the destination this determines the places that an individual has to pass through the get to a destination, also termed as the through movement component.

Thus in graphical terms, the total angular depth  $D_{\theta}(x, y)$  is the total angular turn from one segment to another following the shortest angular route, where x is the starting segment and y is the terminating segment of the path. If we consider Figure 5.7, the angular depth from segment A to segment B will be 0.50 associated with a turn of 45°, while from B to C it is 0.833 corresponding to the another turn of 60°. The total depth from A to C is thus 1.333. Similarly, the cost for moving from A to D is 1.333 corresponding to an angular turn of 135°. Directionality is an important criterion in graph analysis as it is generally assume

that passage through an urban network involves leaving a segment in the same direction as arrival.



Figure 5.7. Paths through a network and their associated justified graph (adapted from Turner, 2007, pg.542).

The final illustration in Figure 5.7 is called the justified graph; that is the graph as seen from a particular location (origin), segment A in this case. The mean depth of any segment x within a graph of n segments is calculated as the average length of all the shortest angular paths within the network. It may be expressed as:

$$\overline{D_{\theta}}(x) = \frac{1}{n} \sum_{i=1}^{n} D_{\theta}(x, i)$$

Thus in the example in Figure 5.7, the mean depth from A may be calculated as:

$$\overline{D_{\theta}}(A) = \frac{[D_{\theta}(A,B) + D_{\theta}(A,C) + D_{\theta}(A,D)]}{3} = \frac{(0.500 + 1.333 + 1.333)}{3} = 1.06$$

However, if A and C are further segmented into  $A_1A_2$  and  $C_1C_2$  respectively, the mean depth from A will vary accordingly:

$$\overline{D_{\theta}}(A) = \frac{[D_{\theta}(A_1, A_2) + D_{\theta}(A_1, B) + D_{\theta}(A_1, C_1) + D_{\theta}(A_1, C_2) + D_{\theta}(A, D)]}{5}$$

It is generally expected that longer segments will contain more origins and destinations of journeys than the shorter segments; hence, some analysts have standardized the depth measure by weighting them with segment length. Thus, if l(i) represents the lengths of any segment i, then the weighted mean depth  $\overline{D_{\theta}^{l}}(x)$  of the segment x in a graph of n segments may be defined as:

$$\overline{D_{\theta}^{l}}(x) = \frac{\sum_{i=1}^{n} D(x,i)l(i)}{\sum_{i=1}^{l} l(i)}$$

In graph-theoretic terminology, the *to-movement* potential is termed 'closeness' (also called integration in space syntax) and measures the ease with which a destination may be accessed within a network. As the mean depth of the central node in an urban network is the minimum, angular closeness has been defined simply as the reciprocal of mean depth as follows:

$$C_{\theta}(x) = \frac{n}{\sum_{i=1}^{n} D_{\theta}(x, i)}$$

while, segment length weighted closeness is:

$$C_{\theta}^{l}(x) = \frac{\sum_{i=1}^{l} l(i)}{\sum_{i=1}^{n} D(x, i) l(i)}$$

The second component of street level accessibility, the *through-movement* potential is captured by the graphical measure of betweenness (Freeman, 1977). It is also termed as *route choice* (or just *choice*) in the space syntax literature and measures the degree of potential for movement through a segment of network. In contrast to closeness, which measures the relative ease of reaching potential destinations, the betweenness index indicates how often people are likely to pass through a particular route (hence also called a *path overlap* index). In other words, betweenness can act as an intuitively more powerful model of physical movement, especially in studies related to an individual's activity behaviour and walkability as when weighted with land uses, it is a manifestation of the *pull effects*, (both attractive and repulsive) of the land uses that are adjacent to a street segment. The superior explanatory power of the betweenness index has been highlighted in several previous studies (Crucitti et al., 2006a, Turner, 2007).

The betweenness measurement comprises of two steps:

- Generation of journeys with lowest angular costs for each and every potential origindestination pair of segments within the network system
- A value of 1 is associated with a segment if it is traversed through on the shortest path from any origin to any destination. The number of journeys made through each segment are summed and then divided by the total number of possible journeys.

In other words, betweenness gives a value to a segment proportional to the estimated (simulated) count of movements passing through the segment from and to all other parts of the network, assuming that journeys in the network follow the shortest angular path between all pairs of segments. Thus as illustrated Figure 5.8, segment AB has the highest path overlapp and through movement potential as compared to the others.

The betweenness  $B_{\theta}(x)$  of the segment x in a graph of n segments may thus be defined mathematically as:

$$B_{\theta}(x) = \frac{\sum_{i=1}^{n} \sum_{j=1}^{n} \sigma(i, x, j)}{(n-1)(n-2)/2},$$

such that  $i \neq x \neq j$ 

where  $\sigma(i, x, j) = 1$ , if the shortest path from i to j traverses through x, and

 $\sigma(i, x, j) = 0$  otherwise.

Again given that longer segments have more origins and destinations along them thereby supporting more journeys, it is often customary to use a segment-length weighted betweenness:

$$B^l_{\theta}(x) = \sum_{i=1}^n \sum_{j=1}^n \sigma^l(i, x, j),$$

such that  $i \neq j$ 

where  $\sigma^{l}(i, x, j) = l(i)l(j)$ , if the shortest path from i to j traverses through x,

$$\sigma^{l}(i, x, j) = \frac{l(x)l(j)}{2}, \text{ if } x \text{ coincides with the origin } i,$$
  
$$\sigma^{l}(i, x, j) = \frac{l(i)l(x)}{2}, \text{ if } x \text{ coincides with the destination } j,$$

 $\sigma^{l}(i, x, j) = 0$ , if x is not in the shortest path between i and j.

l(i), l(j), l(x) are the lengths of segments i, j, and x.

All these graphical street network indices are usually calculated within a user-defined catchment area (termed the *radius*) expressed in metric distance.



**Figure 5.8** The concept of route betweenness; route section AB associated with high path overlap and high through movement potential.

# Working with road centreline data

It has been argued that in conventional space syntax modelling, the axial lines generated for graphical analysis are often prone to subjectivity on account of the preferences of the cartographer who drew them. With a view to devise a system that may enable analysis of topological networks with *minimum interference* and *subjectivity*, Turner (2005, 2007) proposed that ASA can be automated to function using standard geographic road network datasets (such as the UK Ordnance Survey road centre line map, US National TIGER lines) of the street network by employing the standardized segment length weighted approach to calculating network metrics. Changing from an axial map based on lines of site to a road centre-line map is justified as such industry-standard network datasets can provide a more realistic insights into underlying behavioural theory of vehicular and

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pedestrian movement. Furthermore, it overcomes the tedious and somewhat subjective process of cartographic generation of axial line maps. Since 2005, space syntax analysis has been employed using the Ordnance Survey Integrated Transport Network (ITN) layer, including for example one of the most extensive space syntax studies - of the of the economic potential of urban configuration and design in the London Boroughs under the i-VALUL project, a part of the Urban Buzz programme (CABE., 2007, Chiaradia et al., 2012a).

In chapters 5 and 6 of the thesis, angular segment analysis has been performed upon the Ordnance Survey Integrated Transport Network (ITN) layer of Caerphilly. The ITN layer was first subjected to a sequence of editing and simplifications before being subjected to ASA:

- 1) In order to arrive at a simplest set of lines the complicated junctions, dual carriageways etc were first identified and simplified
- 2) All segments in the ITN with an angular threshold less than 5° were joined together to create polylines
- Subsequently, a routine was run to perform the operations of thinning, node snapping, etc. to simplify the geometry
- 4) Segmentation of the ITN was performed to produce a segment map which was then amenable to ASA.

The indices of connectivity, closeness and betweenness were calculated at variable radii and subsequently aggregated both at the dwelling level as well as within 1 kilometre street network buffer of a dwelling. As has been highlighted previously, in addition to the topological properties of the segment, the *pull effects* of the land uses adjacent to it is a very important consideration. In order to incorporate this, I have employed a betweenness measure that has been weighted by both the segment length as well as the presence of health promoting service destination adjacent to it in my network models generated for Caerphilly. This is illustrated in Figure 5.9. In b) the presence of walkable destinations

(health promoting community services present within a 25 metre street buffer;  $O_1$  and  $O_2$  in this case) increases the movement potential so that the betweenness of segments  $BB_1B_2C$  will be higher than the segment BC in a).



Figure 5.9a. Normal segment length weighted betweenness.
5.9b. Betweenness weighted by segment length as well as *health-promoting-community-resources* (O<sub>1</sub>, O<sub>2</sub>) within a 25 metre buffer adjacent to the street.

The network models of closeness and betweenness for Caerphilly are shown in Figures

5.10 and 5.11 respectively.

Figure 5.10. Analysis of closeness of street segments at various scales for the study area.

© Crown copyright database. Modelled from UK Ordnance Survey supplied ITN layer.






**Figure 5.11.** Analysis of street movement potential at various scales for the study area. Betweenness weighted by segment length and land use destinations was modelled over the Ordnance Survey ITN layer. © Crown copyright database. Modelled from UK Ordnance Survey supplied ITN layer.







## spatial Design Network Analysis (sDNA)

Continuing with the principle of *minimum interference* analysis of urban networks, another state-of-the-art technique based on the space syntax concept is the spatial Design Network Analysis (sDNA). It uses a technically improved network algorithm and has been developed by Cardiff University School Planning and Geography (http://www.cardiff.ac.uk/sdna). Representational problems associated with an axial line model of street networks have been previously highlighted (Ratti, 2004, Porta et al., 2006). One of the criticisms often made of angular segment analysis pertains to the tedious process of editing and modification of the road centreline data before processing as well as the issue of reproducibility of the results; minor differences in representation of a geographic feature (different segmentation of the same network) can lead to differences in the graphical representations and hence, variations in the overall results. This has been termed as the modifiable link problem. sDNA can function with off-the-shelf street centreline data such as the Ordnance Survey ITN data with minimum preparation as opposed to axial lines and segments in ASA. Furthermore, it standardizes the network link as the fundamental unit of computation. By using industry standard link representation, it is able to overcome the modifiable link unit problem as well as provide a better physical interpretation of the road centreline data. sDNA has the provision for generating both graphical indices of accessibility as in ASA; as well as user customized weighted indices, for example, weighted (standardized) by link length.

sDNA has been tested and has successfully reproduced results equivalent to or better than predecessor space syntax methods such as angular segment analysis. sDNA is also innovative in its class in providing a workflow that is fully automated. OSM topographic layer, AL2 and ITN linkages are cross referenced through unique identifiers; the Ordnance Survey supports the Digital National Framework which facilitates and supports the integration and sharing of spatial information from diverse sources.

In addition to calculating the indices of connectivity, closeness and betweenness for each link, measures of junction connectivity and network hull area were also included in the study. All the sDNA network metrics were measured at varying spatial radii of 0.5, 1.0 and 1.5 miles and were aggregated to the dwelling of a CaPS respondent. Link connectivity measures the number of connections to each link. The network hull area is the convex area containing all the origins and destinations within a defined radius (see Figure 5.12). The junction connectivity measures the number of junctions (street intersections) within a defined radius (see Figure 5.13). I have employed this technique to arrive at a set of street network accessibility measures in Chapter 8.





ork data source: OSM ITN la

**Figure 5.13.** Analysis of junction connectivity of the street network links at various scales for the study area.

© Crown copyright database. Modelled from UK Ordnance Survey supplied ITN layer.



#### 5.3.4 Natural environment

Natural environment, especially the presence of green spaces is known to have considerable impact upon health outcomes (see section 4.3.3 of chapter 4). In the present study, natural environmental measures of slope variability and greenness were included; the former being particularly variable given the geographical location in the Welsh Valleys. Slope raster was processed from a 5-metre resolution Blue Sky digital terrain model of the study area in Spatial Analyst, ArcGIS 10.0. The slope model of Caerphilly is shown in Figure 5.14. The degree of variability in slope within an individual's home range was

operationalized as the standard deviation of slope in degrees within a 1 kilometer network

buffer of an individual's dwelling.



Figure 5.14. Slope model of Caerphilly.

Satellite derived Normalized Difference Vegetation Index (NDVI) was used as an objective measure of greenness. The NDVI is a unit less index calculated from the reflectance measures in satellite data; comparing the amount of energy absorbed by the chlorophyll in the red portion and the amount scattered by the internal structure of the leaves in the near infra red region (Jensen, 2005). This contrast has been employed as an estimate for vegetation greenness as indicated by the following formula:

$$NDVI = \frac{(NIR - RED)}{(NIR + RED)}$$

where VIS and NIR stand for the spectral reflectance measurements acquired in the visible (red) and near-infrared regions, respectively. The index ranges between -1 and +1 with higher values reflective of healthy green vegetation and *vice versa*. A 30-metre resolution Landsat 7 dataset was employed and the NDVI index was calculated in Raster Calculator - Spatial Analyst, ArcGIS 10.0. The Landsat band 3, 630-690 nm was used as the RED region of electromagnetic spectrum while, band 4, 760-900 nm acted as the infrared region so that the formulae used was NDVI = (Band 4 - Band 3) / (Band 4 + Band 3). The greenness was calculated as the mean NDVI within a 500 metre circular buffer of an individual's dwelling. The NDVI model of Caerphilly is reproduced in Figure 5.15.



Figure 5.15. NDVI index of greenness for Caerphilly.

#### 5.3.5 Area-level deprivation

The Welsh index of multiple deprivation (WIMD), 2005 scores measured at the level of Lower Super Output area (LSOA) census areas have been employed as indicators of neighbourhood deprivation. The UK Office of National Statistics has defined LSOAs as relatively stable, compact geographical units with reasonable degrees of homogeneity in shape and social composition and an average population of 1500 persons for Wales (Martin, 1997, 1998, Bates, 2006, Flowerdew et al., 2008). The WIMD comprises seven unitless indicators of disadvantage (so-called *domain indices*) for income, employment, health, education, housing, physical environment and access to services (Welsh Local Government., 2005). The Welsh Assembly constituency of Caerphilly comprises of 54 LSOAs (Figure 5.16).



Figure 5.16. Area deprivation measured at the level of lower super output areas (LSOAs).

#### **5.3.6 Dwelling level morphometrics**

These measures were calculated through a set of GIS gueries for each of the respondent's dwelling unit. One is a measure of dwelling type, the other three are alternative measures of dwelling centred density, plot exposure, dwelling type and dwellings per street segment (illustrated in Figure 5.17). Dwelling-centred density refers to the immediate residential density surrounding a dwelling unit and is expressed as the number of dwellings in a 30m radius surrounding the dwelling unit. Plot exposure evaluated the number of faces of a dwelling unit exposed to public space and was categorized as zero, one and more than one, with one acting as the reference category. Dwelling type refers to the type of dwelling unit and comprises four categories: detached, semi-detached, terraced and flats (apartment). Detached dwellings have been defined as having one dwelling per building and with no adjacent neighbour. Semi-detached dwellings have one dwelling per building and with one adjacent neighbour. Terraced houses are those that have one dwelling per building and a neighbour that has more than one neighbour, while flats contain more than one dwelling per building. Dwellings per street segments: refers to the number of dwellings connected to each street segment of the route network. A dwelling can be connected to more than one street segment if it has multiple exposures.









Figure 5.17. Dwelling level morphometrics a) Residential density with a 30 metre radius b) Plot exposure c) Dwelling type d) Dwellings per street segment.

# 5.4 Preliminary exploratory data analysis

Variables of theoretical importance were first identified from the literature review for inclusion in the statistical models. The preliminary model-building exercise comprised of a set of standard statistical tests for initial screening, iterative grouping and testing for variable selection to obtain a parsimonious model fit.

- 1) In the first instance, bivariate correlation analysis was performed to assess the level of correlations between the various built environment parameters.
- 2) Secondly, uni-variate regression analyses were performed to assess the crude point estimates and level of significance of associations between health outcomes and the various attributes of built environment to select covariates significantly associated with depression. Key built environment variables including the significant street accessibility betweenness index at specific radii were selected.

- BE variables were included in preliminary multi-variate regression models. Step-wise approach was iterated.
- 4) A subset of BE explanatory variables were identified based on steps 1, 2, and 3. Subsequently, assessment of variance inflation factors (VIFs) of the explanatory built environment variables in single-level regression further enabled that multi-collinearity was avoided. The maximum correlation coefficient observed between the predictors was 0.65 and this was well within the standard rule-of-thumb for cut-off of 0.7r indicating sufficient independent variance. All estimated VIFs were less than 5, the cut-off for significant multi-collinearity (Kutner et al., 2004).
- Model statistic in the form of R<sup>2</sup>, log likelihood, AIC, BIC were compared between the iterated models so as to select the most stable one.

In the subsequent Chapters 6-7, betweenness index of street network accessibility was measured at multiple radii at local-, city- and regional-scales. The above-mentioned series of statistical iterations enabled the identification of three radii, 1200m at local scale, 3000m at city scale and the global N for the study area. Chapter 8 followed a similar methodology identifying 0.5 mile (~800m) and 1.0 mile (~1600m) as the significant radii at local scale. However, as the objective of the experiment was to decipher the potential impacts of built environment at multiple spatial scales, sDNA metrics at a specific radius were introduced separately in the models.

It must be mentioned that although the closeness metrics was constructed and included in my preliminary analysis, however, it was dropped off from the final list of variables. This was on account of it being mostly non-significant in bivariate models or otherwise being multi-collinear with the betweenness index at the corresponding radii. Moreover, as has been highlighted before, the betweenness index has comparatively superior explanatory power especially in studies associated with individual activity behaviours than the closeness index (Crucitti et al., 2006a, Turner, 2007) and hence conceptually more illuminating in built environment - health models.

# 5.5 Discussion

A review of the public health literature on the contextual determinants of health indicates that many studies employ self-reported perceived rather than objective measures of the built environment. Such studies fail to fully overcome the inherent weaknesses of the perceptions and judgments of local residents: being weak in validity and reliability (Leslie et al., 2007, Saarloos et al., 2011). In recent years, advances in spatial information sciences, notably the emergence of spatial modelling and network analyses techniques have a significant potential to contribute in the domain of spatial epidemiology (Macintyre et al., 2002, Pearce et al., 2006, Leslie et al., 2007, Ball et al., 2012). Detailed objective assessment of the built environment is a rapidly growing research domain and has the potential to enhance the conceptual and methodological rigour in investigations of built environment - behaviour associations. In order to understand how the built environment variables influence individual behaviours via, physical activity, social capital and mental health, it is necessary to identify and objectively measure specific attributes of the built environment that may promote/inhibit healthy living. Many ecological studies have attempted to isolate the effects of built environmental factors upon health. There is a need and a growing ability to empirically test such propositions with the help of objectively measured built environment attributes to which an individual is exposed. The primary aim of this thesis in developing sDNA-UH has been to enable objective assessment of the built environment in public health studies.

One of the advantages of the present study stems from the fact that a more holistic twocomponent definition of accessibility has been employed as per Koenig (1980). Conventionally, the notions of accessibility tend to expressed as primarily a function of the spatial location of land use destinations (Curtis and Scheurer, 2010). Generally, spatial separation model measures the degree of travel resistance between origins and destinations, expressed as generic distance decay functions, while contour model enumerates density of destinations within predefined travel-time catchments. In contract,

a gravity model explicitly enumerates the actual travel time from an origin and accordingly categorizes corresponding accessibility of opportunities in terms of time costs. In my study, in addition to the measures of network distance and density of opportunities which form the *activity element* of accessibility in reference to land use destinations, space syntax based betweenness constitute the second component of accessibility, namely the *transport element*. This is based on the widespread realization that accessibility is as well a function of the configuration of the intervening spaces between the origins and destinations and which must be traversed. The betweenness is a graphical index of degree of *centrality* of a street link with respect to the entire street network simulated as the total sum of through-movement through the street link. More intuitively, the measure enables us to capture the impact of urban topology, form and hence legibility upon travel costs and accessibility. Secondly, such an index is a dynamic one as enumeration of betweenness at multiple catchment radii enables us to capture the physical street network accessibility at multiple urban spatial scales via local-, community- and regional.

The present study employed street network accessibility metrics obtained from the conventional space syntax analysis (derived by angular segment analysis - ASA) as well as the more those derived from the contemporary spatial design network analysis (sDNA). Although based on a same conceptual origin, the ASA divides the ITN links in to a number of segments based on angular costs and performs the graphical analyses while, sDNA standardizes the ITN links as the fundamental unit of computation. The later is computationally more efficient, producing a more reliable and reproducible results on account of having an industry standard underlying data structure. sDNA also has a larger variety of network accessibility indices and may produce more efficient results especially in highly dense networks in big cities. Both versions of the street network analysis were tested in my thesis and as will be unveiled in Chapter 6 and 8, they produced almost equivalent results.

As opposed to many previous studies that have tended to depend on parcel level cadastral data for land use metrics, the present study employed the more accurate building footprint data derived from UK Ordnance Survey topographic layer and address layer 2. Nonetheless, the lack of more accurate floor-level data in my research is acknowledged. However, the potential error induced on account of its omission will have been relatively minor. An assessment of the BlueSky LiDAR data (building height) as well as the address layer 2 data indicate that there is relatively very low vertical mixing of land uses in the study area, given that Caerphilly is semi-urban low density commuting town, north of Cardiff. Furthermore, statistical adjustments for dwelling-level variables; type, plot exposure, centred-density as well as the multi-domain neighbourhood-level deprivation would have to a significant extent minimized such sources of error. At the same time, scaling-up the present study to high density urban areas with significant horizontal and vertical mix will necessitate floor area based land use metrics for more accurate results. Floor area estimation methodology developed by Orford (2010) employing OSM and LiDAR datasets may be employed as a practical solution for the lack of floor area datasets in the UK.

The subsequent three chapters report studies that employ the detailed morphometrics of SDNA-UH.

# Chapter 6: Urban built environment configuration and psychological distress in later life: Cross-sectional results from the Caerphilly study

# 6.1 Contextual urban environment and mental health

Psychological disorders accounts for substantial proportions of the burden of disease worldwide. Approximately, 14% of the global disease burden has been attributed to neuropsychiatric disorders, mostly depression, alcohol-substance abuse and psychoses, accounting for 28% of all disability-adjusted life-years (Murray and Lopez, 1996, Prince et al., 2007). The World Health Organization (WHO) had identified depression as the cause of the greatest proportion of non-fatal health burden contributing to almost 12% total years lived with disability (Üstün et al., 2004). An estimate puts the total cost of adult depression in England at over  $\pounds$  9 billion, with  $\pounds$  370 million accrued towards direct treatment costs to the NHS (Thomas and Morris, 2003). The impact of psychological disorder is all the more significant in case of older adults for whom cognitive functioning forms the primary determinant of functional capacity and quality of life (Lebowitz et al., 1997).

In recent years, several studies have highlighted the associations between psychological disorders and contextual urban environment characteristics. In addition to the impact of socio-economic inequality and residential stability of urban neighbourhoods (Faris and Dunham, 1939, Wilson, 1991, Propper et al., 2005, Kubzansky et al., 2005, Subramanian et al., 2006, Fone and Dunstan, 2006, Aneshensel et al., 2007, Wight et al., 2009) upon mental health, myriad built environmental factors have been implicated. Associations have been found between psychological wellbeing and housing structural attributes (Evans et al., 2000a, Evans et al., 2002a, Galea et al., 2005a); dwelling level architectural features (Weich et al., 2002, Brown et al., 2009b); observable neighbourhood environmental

quality (Araya et al., 2007, Thomas et al., 2007); access to facilities and green space (Takano et al., 2002, de Vries et al., 2003, Guite et al., 2006); street quality (Balfour and Kaplan, 2002); and neighbourhood walkability (Berke et al., 2007a, Sallis et al., 2009b). Most studies have either employed composite (Araya et al., 2007, Thomas et al., 2007, Sallis et al., 2009b, Berke et al., 2007a) or self-report (Guite et al., 2006, Leslie and Cerin, 2008) measures of the built environment which often fail to isolate the effects of specific attributes of built environment upon psychological health. As far as I can determine, there has been only one study examining the associations between detailed built environmental configuration and psychological health in older adults. The study examined the association between objectively measured components of the built environment and mental health, finding higher levels of depression with higher degrees of land-use mix and greater retail availability (Saarloos et al., 2011).

In the present study, I hypothesize two underlying mechanisms through which neighbourhood built environment configuration may influence mental health in older adults. Firstly, the configuration of land use (in terms of mix, density, and destination accessibility) as well as street networks (connectivity and movement potential) contributes to the supportiveness of the neighbourhood environment by promoting enhanced accessibility to health promoting community resources (Bernard et al., 2007). This promotes local opportunities for outdoor activities such as utilitarian walking to services, leisure walking, cycling etc. At the same time, the presence of certain destinations may act as barriers to accessibility and healthy living. The protective effects of neighbourhood walkability and physical activity upon psychological disorder in older adults have been well established (Strawbridge et al., 2002, Bean et al., 2004, Weuve et al., 2004, Berke et al., 2007a, Wiles et al., 2007). Secondly, the residents of a neighbourhood with optimised built environment design have a greater incentive to be outdoors; which in turn will facilitate social inclusion through interactions with friends and neighbours. The positive association between social ties and mental well-being has been well documented (Kawachi and

Berkman, 2001, Leyden, 2003, Cohen, 2004). These relationships are of particular importance in older adults, whose daily activities tend usually to be confined to the vicinity of their dwelling, making them more sensitive to the health promoting/inhibiting attributes of neighbourhood physical configuration (Diez Roux, 2002, Balfour and Kaplan, 2002). I test these hypotheses by examining the independent association of a wide range of morphological metrics (morphometrics) with psychological distress in a population of older men. Furthermore, the natural elements of a neighbourhood environment have been known to influence mental health outcomes (Grahn and Stigsdotter, 2003, Sugiyama et al., 2008) both directly as well as indirectly in terms of enhanced neighbourhood satisfaction and actual service use (Kaplan, 2001, Ellis et al., 2006). On the contrary, neighbourhood level deprivation has been shown to exacerbate mental health (Caspi et al., 2000, Stafford and Marmot, 2003). This chapter examines the impact of objectively assessed built environment configuration upon psychological distress and whether this association is moderated by the natural environment and area-level deprivation.

# 6.2 Methods

#### 6.2.1 Study design

The study is based on the 5<sup>th</sup> phase of the Caerphilly Prospective Study (CaPS), a population-based male cohort in the Welsh Assembly constituency of Caerphilly, South Wales, UK. Further details of the CaPS cohort can be found in Chapter 4. Briefly, the 5<sup>th</sup> examination was conducted during 2002-2004 and comprised 1225 surviving cohort members aged 65-84 years. Extensive clinical examinations included anthropometry, assessment of blood pressure, electrocardiogram as well as collection of fasting blood samples.

#### Psychological distress measures and individual level covariates

Psychological distress was measured employing the 30-item General Health Questionnaire (GHQ-30), a self-completion instrument widely used to rate levels of psychological distress and psychiatric disorders (Goldberg and Williams, 1988). The factors of the 30-item General Health Questionnaire are reproduced in Appendix 1. Individual level risk factors including age, alcohol consumption and smoking status as well as socio-demographic measures of marital status, social class and educational attainment were collected. The study presented in this Chapter also controlled for the existence of vascular morbidities, expressed in terms of prevalence of myocardial infarction, angina, high blood pressure, high cholesterol, diabetes and stroke.

#### The built environment

The conceptual path model illustrated in Figure 6.1 provides the theoretical framework for the study and guided the formulation and operationalization of a set of robust model variables of built environment configurations and individual level covariates extracted from the spatial Design Network Analysis for Urban Health (sDNA-UH). A set of built environmental factors acting in conjunction with the physical environment, and neighbourhood deprivation have been posited to configure the psychological health of an individual. The built environment provides the activity space wherein people interact and our perceptions of the environment are formed (including perceptions of psychosocial stressors, resources and activity friendliness). Individual level factors such as sociodemographics, lifestyle, genetics and prevalence of morbidities and levels of cognitive health have the potential to directly define psychological health as well as indirectly, through their impact upon the perceived mediators. The present study aimed to objectively measure the various facets of built environment configuration and directly establish their potential impact upon psychological health, with the variables of physical environment, neighbourhood deprivation as well as individual level factors acting as potential confounders in my statistical models.



Figure 6.1. Conceptual path model depicting the relationship between built environment and mental health.

Built environment measures from the SDNA-UH were operationalised within a 1kilometre street-network buffer around an individual respondent's dwelling unit. Dwellinglevel configurations comprised plot exposure, dwelling-centered density and dwelling type. Land use configurations were captured through measures of mix and density. A fivecategory land-use mix score was developed comprising residential dwellings, retail, community services, business and offices and recreation and leisure facilities. The densities of public transit (bus stops), retail, community services, recreation and leisure, and business and offices were calculated as the number of units divided by the total area within a 1 kilometre street-network buffer of a respondents dwelling unit. Space syntax modeling was used to measure the accessibility of street-network segments (Hillier and Hansen, 1984, Hillier et al., 1993, Hillier, 1996, Bafna, 2003, Hillier, 2012, Baran et al., 2008). The space syntax model of urban network configuration has its origin in graph theory and quantitatively measures the relational properties of urban space. In an urban space comprising interconnected sub-spaces, those that are directly linked through better physical connections and longer unhindered fields of visual sight have better syntactic accessibility and hence, are associated with higher movement densities. To operationalize this, the OSM ITN layer of Caerphilly was edited, simplified and transcribed in to a road centreline map, which is essentially a model of the street network configuration using the simplest set of line segments representing the longest lines of visual sight. This essentially enables us to capture the effects of changes in direction and the presence of intervening streets upon individual's sense of orientation in an urban space.

As described in Chapter 5, angular segment analysis (Turner, 2007) of the streetnetwork was performed on the ITN layer in Confeego (Gil et al., 2007) to determine two indices of street-network accessibility – *connectivity* and *betweenness*. They act as meaningful proxies for the degree of *connectedness* as well as *walkability* of streetnetwork segment in the present study. *Connectivity* of a street segment measures the number of segments directly connected to it and is synonymous with the density of street intersections, while *betweenness*, also sometimes termed as betweenness centrality measures the through-movement-potential of the street segment. In my models, betweenness was measured for each street segment with reference to networks defined at three spatial scales. The radii were chosen after a series of iterations for attain parsimonious fit. At a local scale, measuring the metrics at a 1200-metre radius (equivalent to 15 minutes stroll), betweenness captures pedestrian behaviour, street segments with high betweenness being more likely to be used by pedestrians. Given the spatial extent of Caerphilly, a radius of 3000 metres was employed to measure the city-

scale accessibility, while at N meters (the longest distance between two segments in the spatial model), the betweenness index becomes an indicator of regional accessibility capturing transit behaviour; high betweenness being synonymous with traffic density and congestion.

#### Natural environment

Natural environmental measures of slope variability and greenness were included in the models, the former being particularly variable given the geographical location in the Welsh Valleys. Slope variability within an individual's home range was operationalized as the standard deviation of slope in degrees within a 1 kilometer network buffer of an individual's dwelling. Satellite derived Normalized Difference Vegetation Index (NDVI) was used as an objective measure of greenness, calculated as the mean NDVI within a 500 metre circular buffer of an individual's dwelling.

#### Area-level deprivation

In order to study the effect of area-level deprivation upon psychological distress, Welsh index of multiple deprivation (WIMD) scores were used, measured at the level of Lower Super Output area (LSOA) census areas. In the present analysis, six of the seven domain indices were included; while the domain 'access to services' was excluded to avoid any potential collinearity.

#### 6.2.2 Statistical methods

The impact of built environment configuration upon psychological distress was examined through a two-part multi-level regression model with individual respondents being nested within census-defined LSOAs. It was observed that the GHQ-30 scale was semicontinuous with a significant proportion of zeros (indicating non-existence of symptoms of psychological distress) and exhibiting a right-skewed distribution (Figure 6.2).



**Figure 6.2.** Frequency distribution of the GHQ-30 scores of 687 individuals of the 5<sup>th</sup> phase of Caerphilly Prospective Study (CaPS).

The prevalence of psychological distress was therefore modeled as a two-level factor (case vs. non-case). A cut-point of GHQ score  $\geq$  5 was employed; indentified from a validation study conducted for CaPS respondents (Stansfeld et al., 1991). In the first part, two-level logistic mixed effects models with LSOA-level random effects were fitted on the case/non-case binary GHQ scores. A subset of the sample exhibiting non-zero GHQ-30 score was extracted and sensitivity analysis was performed to explicitly examine the associations between the intensity of psychological distress (indicated by non-zero GHQ-30 score) and the characteristics of built environment configurations, without imposition of the case-threshold. Hence, the second part comprised a two-level gamma mixed regression model (gamma regression being used to account for the skewed, non-normal distribution of the GHQ-30 scale) with LSOA-level random effects for all the non-zero GHQ-30 scores (indicative of the prevalence of symptoms of psychological distress).

Land use mix was transformed into tertiles (low, medium, high) while standardized zscores were used for topological accessibility variables to enhance the interpretation of results. For area-level variables, deprivation domain scores ranged between 0-100 with higher scores indicating more deprivation and slope variability and NDVI modeled as standardized z scores.

Age (years) and alcohol consumption (ml/week) were modeled as continuous variables. Social class was expressed in terms of six groups following the Registrar General's occupational classification (Office of Population Censuses and Surveys (OPCS), 1980) and thereafter collapsed into a three-level factor (I, II, III-non-manual/ III-manual/ IV, V). Marital status modeled three-level factor (married, was as а single, widowed/divorced/separated); as was education (none/apprenticeship, school certificate/higher technical certificate, professional qualification/degree/higher degree). The morbidities of myocardial infarction, angina, high blood pressure, high cholesterol, diabetes and stroke were modelled as two-level factors (present/ absent).

Statistical analyses were performed in GLLAMM (GLLAMM., 2010) within the Stata 11.2 (StataCorp, College Station, TX) statistical software package.

## 6.3 Results

Completed GHQ scores were assessed for 814 men; 745 of who remained within the geographical boundary of the study area, the rest having migrated. After exclusions for missing data across all categories, the study constituted 687 valid responses residing within 34 LSOAs. The number of respondents per LSOA ranged from 6-47, with a mean of 20.2 (SD = 12.7). The descriptive statistics of the representative sample across the *case* and *no-case* categories as well as the significance of the between-group difference are presented in Table 5.1. The prevalence rate of psychological distress was 19.4% and the mean age of the sample was 73.5 years (SD = 4.3). Mental health was associated with educational attainment, angina, myocardial infarction, high blood pressure and stroke. The

descriptive statistics of environmental variables within 1 km street buffer employed in the study have been categorized as dwelling level, land use configuration, topological accessibility of street, natural environment and area level deprivation variables (Table 6.2).

	GHQ-30 case		
Individual level confounders	Case (n=133) GHQ-30 ≥ 5	No case (n=554) GHQ-30 < 5	p-value of difference
Age; Mean (SD)	73.7 (4.3)	73.5 (4.3)	0.549
Alcohol consumption; Mean (SD)	49.8 (100.6)	57.5 (96.7)	0.018
Social class (partly skilled/unskilled); N(%)	25 (18.8)	72 (13.0)	0.085
Educational attainment (None/apprenticeship) ; N(%)	92 (69.2)	336 (60.6)	0.050
Prevalence of chronic disease			
Heart attack/coronary thrombosis; N(%)	29 (21.8)	70 (12.6)	0.007
Angina; N(%)	46 (34.6)	105 (19.0)	0.005
High blood pressure; N(%)	72 (54.1)	241 (43.5)	0.027
High cholesterol; N(%)	42 (31.6)	163 (29.4)	0.626
Diabetes; N(%) Stroke; N(%)	22 (16.5) 23 (17.3)	73 (13.2) 52 (9.4)	0.313 0.006

#### **Table 6.1.** Characteristics of the study sample according to GHQ status.

Table 6.3 presents the results of logistic mixed models to assess the associations between the prevalence of psychological disorders and measurements of built environment configuration, followed by the gamma mixed model for sensitivity analysis. The analytic plan consisted of four analyses. Model 1 examined the associations of psychological distress with the built environment variables with adjustment for individual level covariates. Model 2 examined the association of psychological distress with area level variable (WIMD, slope variability and greenness) also adjusting for individual level covariates. Model 3 examined the association of psychological distress with both built environment and area level variables after adjustment for covariates. Apart from these case threshold (GHQ-30  $\geq$  5) models, the psychological distress model using non-zero GHQ- 30 scores as a continuous variable for sensitivity analysis. Model 4 presents the results of the gamma mixed model performed over a subset of 314 individual men

exhibiting a non-zero GHQ-30 score after adjustments for area-level deprivation domain

indices, natural environment and covariates.

Table 6.2. Summar	y of	environment	variables.
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Environmental variables	Mean (SD)	Range		
Built Environment morphometrics				
Dwelling level variables <sup>a</sup>				
Dwelling centred density (within 30 m radius)	14.29 (6.64)	1 - 40		
Dwelling types; N (%) Detached	156 (22.70)			
Semi- detached	299 (43.52)			
Terraced	176 (25.63)			
Flats	56 (8.15)			
Plot exposure; N (%) No building fonts exposed to public				
space	76 (11.06)			
One building fonts exposed to public space	471 (68.56)			
More than one building fonts exposed to public space	140 (20.38)			
<i>Land use configuration</i> (within 1km street network buffer) <sup>o</sup>				
Land use mix	0.14 (0.03)	0.03 - 0.21		
Density of bus stops	23.96 (6.00)	7.66 - 50.46		
Density of retail	26.92 (27.58)	1.40 - 140.7		
Density of community services	14.36 (9.93)	1.00 - 50.95		
Density of recreation & leisure facilities	12.91 (5.11)	2.12 - 34.49		
		0.87 -		
Density of business & offices	30.69 (32.76)	130.53		
Topological accessibility of streets (measured for each st	reet segment at va	rying radii) <sup>c</sup>		
Betweenness R1200m	2.40 (0.17)	1.76 - 2.82		
Betweenness R3000m	3.01 (0.21)	2.40 - 3.54		
Betweenness RNm (all networks segments)	3.63 (0.20)	2.92 - 4.29		
Connectivity	3.13 (0.19)	2.66 - 3.65		
Natural Environment				
Topography (variability of slope within 1 km street network b	ouffer) <sup>a</sup>			
Neighbourhood slope variability (mean)	<sup>´</sup> 3.31	0.99 - 8.04		
Greenness (within 500 m airline buffer of dwelling) <sup>e</sup>				
Mean NDVI	0.091	-0.06 - 0.33		
Area-level deprivation				
WIMD -2005 (within census defined lower super output area	as) <sup>†</sup>			
Income domain	24.05 (19.78)	0.34 - 90.32		
Employment domain	25.73 (19.14)	1.00 - 95.02		
Health domain	25.64 (15.71)	1.70 - 72.3		
Education domain	25.82 (16.95)	0.59 - 62.32		
Housing domain	10.91 (7.44)	0.19 - 27.23		
Physical domain	<u>19.11 (</u> 14.63́)	1.61 - 65.4		

<sup>a</sup> Dwelling level data extracted from Ordnance Survey Address Layer 2.

<sup>b</sup> Land use data was extracted from Ordnance Survey Address Layer 2.

<sup>c</sup> Street network was extracted from Ordnance Survey Integrated Transport Network Layer, transformed and subjected to space syntax analysis in Confeego. Measured for each street segment at varying radii of capture the effect of multiple urban scales: regional/ city scale (N, 3000 m), and local/walking distance scale (1200m). Thereafter, connectivity and betweenness were aggregated at the level of a 1 km street network buffer. <sup>d</sup> Slope raster was processed from the BlueSky 5 metre resolution DTM). Measured as the standard deviation

<sup>a</sup> Slope raster was processed from the BlueSky 5 metre resolution DTM). Measured as the standard deviation of slope in degrees within 1 km street network buffer.
<sup>b</sup> Greenness was measured as the Normalized Difference Measured in Index (NDM) from the 20 m Logistical standard deviation.

<sup>e</sup> Greenness was measured as the Normalized Difference Vegetation Index (NDVI) from the 30 m Landsat data.

<sup>f</sup> Area-level deprivation was expressed in terms of the six domain indices of the Welsh Index of Multiple Deprivation, aggregated at the small area level of LSOAs.

# **Table 6.3.** Results of mixed regression with LSOA-level random effects for GHQ-30 case and non-zero GHQ-30 scorefor the 5<sup>th</sup> phase of Caerphilly Prospective Study (CaPS).

	Prevalence of psychological distress (logistic model); N = 687			Sensitivity analysis (gamma model); N = 314
Model Predictors	Model 1 <sup>†</sup>	Model 2 <sup>†</sup>	Model 3 <sup>†</sup>	Model 4 <sup>‡</sup>
	O.R. (95% C.I.), p-value	O.R. (95% C.I.), p-value	O.R. (95% C.I.), p-value	Beta (95% C.I.), p-value
Built environment morphometrics				
Dwelling level variables				
Dwelling centered density	1.02 (0.97, 1.08) p = 0.43		1.02 (0.97, 1.07) p = 0.53	0.01 (-0.01, 0.03) p = 0.40
Plot exposure (none vs. one bldg face)	0.98 (0.55, 1.73) p = 0.94		0.99 (0.57, 1.71) p = 0.97	-0.15 (-0.44, 0.13) p = 0.30
Plot exposure (> one faces vs. one bldg face)	0.77 (0.52, 1.14) p = 0.19		0.78 (0.53, 1.15) p = 0.20	-0.15 (-0.39, 0.09) p = 0.23
Dwelling type (semi-detached vs. detached)	0.72 (0.41, 1.27) p = 0.26		0.74 (0.42, 1.31) p = 0.30	-0.06 (-0.33, 0.22) p = 0.69
Dwelling type (terraced vs. detached)	0.59 (0.26, 1.36) p = 0.22		0.48 (0.19, 1.20) p = 0.12	-0.28 (-0.61, 0.06) p = 0.10*
Dwelling type (flat vs. detached)	0.66 (0.20, 2.16) p = 0.49		0.75 (0.24, 2.37) p = 0.62	0.14 (-0.45, 0.73) p = 0.65
Land use configuration				
Land use mix (z-score)				
T2 vs. T1	0.74 (0.44, 1.25) p = 0.26		0.63 (0.38, 1.03) p = 0.07*	-0.07 (-0.33, 0.19) p = 0.62
T3 vs. T1	0.54 (0.32, 0.92) p = 0.02**		0.43 (0.23, 0.80) p < 0.01***	-0.43 (-1.01 ,0.15) p = 0.15
Density of bus stops	1.04 (1.00, 1.08) p = 0.08*		1.06 (1.01, 1.11) p = 0.012**	0.03 (0.00, 0.06) p = 0.08*
Density of retail	0.99 (0.96, 1.01) p = 0.31		0.99 (0.96, 1.03) p = 0.70	-0.001(-0.02, 0.02) p = 0.93
Density of community services	1.01 (0.96, 1.07) p = 0.70		0.99 (0.94, 1.05) p = 0.84	-0.01 (-0.04, 0.03) p = 0.74
Density of recreation & leisure facilities	0.98 (0.94, 1.02) p = 0.38		1.00 (0.95, 1.06) p = 0.91	0.004 (-0.02, 0.03) p = 0.76
Density of business & offices	1.02 (1.01, 1.03) p < 0.01***		1.02 (1.01, 1.04) p < 0.01***	0.01 (-0.01, 0.03) p = 0.22
Topological accessibility of streets (z-score)				
Betweenness R1200m	0.53 (0.36, 0.79) p < 0.01***		0.41 (0.21, 0.79) p < 0.01***	-0.24 (-0.53, 0.05) p = 0.10*
Betweenness R3000m	0.94 (0.63, 1.39) p = 0.75		1.70 (0.88, 3.30) p = 0.11	0.17 (-0.18, 0.53) p = 0.33
Betweenness RNm	1.58 (1.17, 2.12) p < 0.01***		1.00 (0.64, 1.56) p = 0.94	-0.18 (-0.50, 0.14) p = 0.26

Connectivity	1.10 (0.85, 1.40) p = 0.47		1.27 (0.97, 1.66) p = 0.09*	0.06 (-0.07, 0.19) p = 0.34
Natural Environment				
Topography (Standard deviation in slope)		1.38 (1.11, 1.71) p < 0.01***	1.72 (1.18, 2.51) p < 0.01***	0.20 (0.04, 0.37) p = 0.01**
Greenness (Mean NDVI within 500m)		0.76 (0.58, 0.99) p = 0.04**	0.85 (0.58, 1.24) p = 0.40	-0.15 (-0.36, 0.07) p = 0.18
Neighbourhood Deprivation				
Income deprivation		1.03 (1.00, 1.07) p = 0.05**	1.02 (0.98, 1.06) p = 0.36	0.02 (0.00, 0.04) p = 0.10*
Employment deprivation		0.96 (0.93, 0.99) p < 0.02**	0.95 (0.92, 0.98) p < 0.01***	-0.03 (-0.05, -0.02) p < 0.01***
Health deprivation		0.99 (0.98, 1.01) p = 0.29	1.00 (0.99, 1.02) p = 0.71	0.001 (-0.004, 0.01) p = 0.52
Education deprivation		1.00 (0.97, 1.03) p = 0.84	1.04 (1.00, 1.08) p = 0.04**	0.02 (0.00, 0.04) p = 0.03**
Housing deprivation		0.99 (0.96, 1.03) p = 0.71	0.98 (0.94, 1.02) p = 0.35	-0.003 (-0.03, 0.02) p = 0.85
Physical environment		1.02 (1.01, 1.04) p < 0.01***	1.02 (1.01, 1.04) p < 0.01***	0.006 (0.00, 0.02) p = 0.18
Individual Covariates				
Lifestyle & Socio-demographic				
Age	1.02 (0.97, 1.08) p = 0.37	1.02 (0.97, 1.07) p = 0.51	1.02 (0.96, 1.08) p = 0.56	-0.002 (-0.03, 0.02) p = 0.88
Alcohol consumption	1.00 (1.00, 1.00) p = 0.84	1.00 (1.00, 1.00) p = 0.97	1.00 (1.00, 1.00) p = 0.95	-0.0001 (-0.001, 0.001) p=0.79
Smoking status (ex-smoker vs. non-smoker)	0.91 (0.50, 1.63) p = 0.74	0.90 (0.52, 1.55) p = 0.70	0.88 (0.50, 1.57) p = 0.67	-0.09 (-0.32, 0.14) p = 0.46
Smoking status (current smoker vs. non-smoker)	1.47 (0.72, 3.03) p = 0.29	1.41 (0.71, 2.79) p = 0.33	1.50 (0.72, 3.13) p = 0.28	-0.11 (-0.44, 0.22) p = 0.50
Marital status (single vs. married)	1.01 (0.33, 3.08) p = 0.99	1.04 (0.32, 3.39) p = 0.95	1.05 (0.34, 3.23) p = 0.93	-0.25 (-0.76, 0.25) p = 0.33
Marital status (widowed/separated vs. married)	0.81 (0.36, 1.81) p = 0.61	0.88 (0.42, 1.85) p = 0.74	0.90 (0.40, 1.99) p = 0.79	0.08 (-0.27, 0.43) p = 0.65
Social class (III-manual vs. I, II III-non-manual)	0.97 (0.54, 1.76) p = 0.92	0.93 (0.49, 1.75) p = 0.81	1.00 (0.52, 1.91) p = 0.90	-0.02 (-0.29, 0.26) p = 0.91
Social class (IV, V vs. I, II III-non-manual)	1.49 (0.84, 2.64) p = 0.17	1.27 (0.71, 2.26) p = 0.42	1.59 (0.86, 2.97) p = 0.14	0.13 (-0.26, 0.52) p = 0.51
Education (School certs vs. none/apprentice)	0.83 (0.48, 1.42) p = 0.49	0.89 (0.54, 1.46) p = 0.63	0.79 (0.46, 1.38) p = 0.41	-0.01 (-0.31, 0.29) p = 0.96
Education (Degree vs. none/apprentice)	0.44 (0.21, 0.94) p = 0.04**	0.49 (0.24, 1.03) p = 0.06*	0.44 (0.20, 0.98) p = 0.05**	-0.21 (-0.70, 0.27) p = 0.39
Prevalence of vascular morbidities				
Heart attack/coronary thrombosis (yes vs. no)	1.42 (0.77, 2.62) p = 0.26	1.45 (0.82, 2.57) p = 0.21	1.55 (0.85, 2.84) p = 0.16	0.21 (-0.21, 0.33) p = 0.67

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Angina (yes vs. no)	2.03 (1.06, 3.89) p = 0.03**	2.12 (1.16, 3.90) p = 0.02**	2.09 (1.07, 4.05) p = 0.03**	0.17 (-0.16, 0.49) p = 0.32
High blood pressure (yes vs. no)	1.66 (1.07, 2.57) p = 0.02**	1.55 (0.99, 2.44) p = 0.06*	1.71 (1.08, 2.70) p = 0.02**	0.27 (0.05, 0.50) p = 0.02**
High cholesterol (yes vs. no)	0.75 (0.44, 1.27) p = 0.29	0.75 (0.46, 1.21) p = 0.24	0.76 (0.46, 1.26) p = 0.29	-0.12 (-0.40, 0.17) p = 0.42
Diabetes (yes vs. no)	1.40 (0.85, 2.32) p = 0.18	1.32 (0.79, 2.22) p = 0.29	1.48 (0.86, 2.54) p = 0.16	0.10 (-0.20, 0.39) p = 0.52
Stroke (yes vs. no)	2.17 (0.99, 4.74) p = 0.05**	2.30 (1.10, 4.82) p = 0.03**	2.25 (1.030, 4.93) p = 0.04**	0.13 (-0.08, 0.34) p = 0.22
<i>Model fit</i> -2*Log likelihood	621.88	624.79	603.99	1650.35

Result are expressed as odds ratio, 95% confidence interval and p-value for the logistic regression and beta, 95% confidence interval and p-value for the gamma regression

T: Tertile (T1, T2, T3 represents the lower, middle and upper tertiles respectively)

\*p < 0.10; \*\*p < 0.05; \*\*\*p <0.01

<sup>†</sup> Model 1 comprises of built environmental morphometrics; Model 2 included neighbourhood deprivation captured by six domains of Welsh index of multiple deprivation and natural environment captured by standard deviation in slope and mean greenness index NDVI; Model 3 indicates the fully adjusted model.

<sup>+</sup> Model 4 represents the results of fully adjusted gamma regression model for sensitivity analysis.

Analysis of the built environment morphometric variables without adjustment for area level variables (model 1) found that a higher degree of land-use mix was significantly associated with lower odds of psychological distress (OR = 0.54; p = 0.02 for the highest tertile). The density of business and offices (OR = 1.02; p < 0.01) were associated with higher odds of psychological distress, while density of bus stops was only mildly associated (OR = 1.04; p = 0.08). Topological accessibility of street network at a local level, captured by betweenness at a radius of 1200 metres was beneficially related to mental health (OR=0.53, p < 0.01). However, transit level movement potential captured by the global betweenness was adversely related to mental health (OR=1.58, p < 0.01).

Analysis of the area level variables, without adjustment for morphometric variables (model 2) found that slope variability was associated with poorer mental health (OR=1.38, p < 0.01). Greenness measured by the NDVI index was beneficially associated with mental well-being (OR = 0.76, p = 0.14). In terms of the WIMD domains greater income deprivation was associated with poorer mental health (OR = 1.03, p = 0.05) whilst greater employment deprivation was associated with better mental health (OR = 0.96, p = 0.02). Greater physical environment deprivation was associated with poorer mental health (OR = 1.02, p < 0.01).

In the fully controlled model with both the morphometric and area level variables together (model 3), higher degrees of land-use mix were associated with reduced odds of psychological distress (OR = 0.63, p = 0.07 for the middle tertile, and OR = 0.43, p < 0.01 for the high tertile). The density of retail or community services or recreation facilities was not related to psychological distress. However, bus stop density (OR = 1.06; p < 0.01), density of business and offices (OR = 1.02; p < 0.01) were associated with higher odds of psychological distress. Higher local-level street movement potential captured by betweenness at a radius of 1200 metres was associated with improved psychological health outcomes (OR = 0.41; p < 0.01), however, the association of mental health with transit route accessibility was lost. Consistent with model 2, hillier topography with higher

slope variability was associated with greater psychological distress (OR = 1.72, p < 0.01), the effects being more pronounced after adjustments of the built environment. However, the NDVI index of greenness was no longer significant. Amongst the deprivation domains employment deprivation had a slight protective effect (OR=0.95, p < 0.01) whilst the education and physical environment domains had a slight harmful effect (OR = 1.04, p = 0.04 and OR = 1.02, p < 0.01 respectively).

In contrast to the findings for the GHQ-30 case, none of the built environment variables are significant (p< 0.05) for a model that seeks to explain variation among men showing some degree of psychological distress (model 4). However, the slope variability factor ( $\beta = 0.20$ ; p = 0.01), the employment ( $\beta = -0.04$ ; p < 0.01) domain of area deprivation remain statistically significant. The area-level *between-LSOA* random effects component of the analysis was observed to be very small throughout these models ( $\hat{\sigma}_{u}^{2} < 0.10$ ) indicating negligible heterogeneity between areas.

# 6.4 Discussion

Consistent with my hypothesis, I have found that a number of land-use and street-network configuration metrics are significantly associated with levels of psychological distress in a representative sample of older men aged 65-84 years. That the associations were attenuated after adjustments for natural environment, deprivation and individual level factors emphasizes their importance. Better psychological health was associated with greater land use mix and with local level street accessibility. Poorer psychological health was associated with higher density of bus-stops and business and office units.

#### 6.4.1 Strengths and limitations

Strengths of these data lie in the population sample, the detailed assessment of the built environment and the multilevel modeling of putative effects. CaPS has achieved high levels of follow-up throughout and care has been taken to achieve high levels of case ascertainment. The sample used for this analysis represents a 79% response rate in the most recent (5<sup>th</sup>) examination. Although CaPS was considered sufficiently large at conception the number of men with dementia was only just sufficient for this analysis.

This study explored the association of a wide range of objectively measured robust spatial metrics of land-use and street-network configurations with psychological health. Several studies have employed composite built environment indices to study their impact upon physical activity (Leslie et al., 2007, Van Dyck et al., 2010, Frank et al., 2010, King et al., 2011) and mental health (Sallis et al., 2009b, Berke et al., 2007a). My study was able to overcome the weaknesses of such composite measures which often fail to isolate the effects of specific attributes of built environment upon psychological health. With respect to the street configuration, the street connectivity measure has been employed in health studies to assess the impact of street intersection density upon physical activity (Frank et al., 2004, Li et al., 2008, Troped et al., 2010). The application of space syntax based street network modeling in this thesis enabled the inclusion of not only street-network connectivity, but also the configurational measure of *betweenness* as model predictors (which acted as proxies for accessibility in terms of walkability and social connectivity in this study). Within a space syntax modelling paradigm, street configurational measurements of syntactic accessibility are directly appended to each street segment, thereby enabling the study of potential independent associations between individual health behaviours and street configuration metric. An inherent advantage of this technique stems from the fact that it enables the analysis of street segments at varying spatial scales, measuring accessibility and movement potential at local, community and regional levels. This allows us to assess the health impacts of accessibility at multiple urban scales. In my models, betweenness of a street segment is proportional to the total simulated counts of passing movements through the segment from and to all the other parts of the network following the shortest angular path heuristic between all pairs of segments. This is supported by evidence that the least angular path analysis is the best

predictor of movement (Hillier and lida, 2005). Thus, the through-movement-potential pertaining to each street segment can be enumerated indicating the odds of it being taken while moving through the urban matrix. Modelling the betweenness at multiple radii enabled the assessment of accessibility at multiple urban scales, and by implication, by different modes. These measures add information over and above more established GIS-constructed land-use measures of mix and density. In addition, the model used objectively measured natural environment descriptors comprising slope variability and the NDVI index of greenery. The multi-level analysis, using a random effects model, allowed area-level clustering as well as individual level variation to be modeled, providing a more accurate analysis.

The two-part modelling provides a rigorous and statistically valid methodology for analysis of the semi-continuous and skewed GHQ-30 scale. A similar two-part approach has been employed for physical activity outcomes (Lee et al., 2010, Lee and Xiang, 2011). This could usefully be extended to other psychiatric scales, which often tend to be skewed towards the baseline, thereby overcoming the need for scale transformation and dependence on predetermined cut-points. The random effects logistic component of the two-part model assesses the effects of built environment configuration upon the odds of prevalence of psychological disorders, while, in the second part, the random effects gamma component, assesses the effects of built environment configurations upon the intensity of psychological disorders. For non-normal distributions, gamma regression is statistically more accurate in providing realistic estimations for small or moderate sample sizes (compared to standard linear regression).

The cross-sectional design of this analysis limits the confidence with which causal interpretations can be made. The sustained effects of built environment factors upon psychological health through different stages of the life course require further exploration. This can only be achieved through longitudinal analyses. Although adjustment for a wide range of confounders enabled several independent effects of the built environment to be

identified, the possibility of residual confounding cannot be excluded. Spatial data were collected as close as possible to the end of CaPS phase V (conducted over the duration of 2002-2004) in order to avoid temporal mismatch (Buzzelli and Su, 2006). Nonetheless, limitations owing to this are likely to have been negligible as the data from Caerphilly County Borough Council indicated relatively stabilized land use and street network characteristics.

#### 6.4.2 Interpretation

Amongst the built environment morphometric results, a lower relative odds of psychological disorder with increasing land-use mix is consistent with the general hypothesis that higher land-use mix is synonymous with enhanced accessibility to health promoting capital. The effects upon psychological health may manifest themselves along two pathways. The diversity and distribution of community resources may enhance the feeling of neighbourhood satisfaction as well as consolidate social connectivity, thereby adding to social capital (Leslie and Cerin, 2008). On the other hand, a higher land use mix has generally been associated with smaller trip lengths, thereby acting as an incentive for physical activity (Frank et al., 2004, Li et al., 2008, Troped et al., 2010). However, it does not confirm the counterintuitive findings from Saarloos et al. who found depression to be positively associated with greater land use mix (Saarloos et al., 2011). Saarloos, acknowledges his findings require further explanation.

Support for the land use hypothesis in terms of the density of specific land use types was however less clear. No association was found between psychological distress and the density of retail, community services, or leisure and recreation units. This runs contrary to expectations based on the impact of the density of these community resources upon physical activity (Frank et al., 2003, Norman et al., 2006, Diez Roux et al., 2007). These null findings may be due to lack of statistical power. However, the odds ratios are uniformly virtually one and this does not seem a likely explanation. Alternatively they may
be due to over adjustment i.e. the masking of an association by the inclusion of an index of land use mix in the same model. This possibility was explored by repeating the analysis omitting land use mix. No evidence for an effect of collinearity was found, however. Another possibility is that there was insufficient variation to detect an association; Caerphilly being a relatively homogeneous area. However, at the same time, the study captured the inhibitory effects of specific land uses. That density of business units was inversely related to psychological distress is consistent with one of the study's hypothesis: areas with predominantly commercial/industrial outlook are usually associated with reduced sense of community; typically associated with unwanted social contacts, having large parking spaces and high traffic (Halpern, 1995, Glass and Balfour, 2003, Wood et al., 2010). The inverse association of psychological distress with density of bus stops was not anticipated. Although this may be a chance effect, it may be that the availability of public transport reduces walking behaviour in older men and this has implications for psychological wellbeing. Density of bus stops may be associated with reduced sense of traffic safety among older adults as well as higher levels of noise pollution. Alternatively, higher density of public transport routes may in this community be a proxy variable for aspects of social deprivation that were not captured through the WIMD. Larger concentrations of lower priced properties in certain locations, for example, have a high propensity for sub-letting and thus a greater tendency for the formation of clusters of vulnerable adults living in low income and supported housing.

The space syntax metrics enabled the study to capture the configuration and design of urban form at multiple spatial scales (Kashef, 2011). Throughout the models, no significant association between psychological distress and street connectivity could be established. Higher local-level street betweenness (measured within a radius of 1200 m) was associated with lower odds of psychological disorder in all models, controlling for all other variables. But higher local-level betweenness of destinations may create a walkable, well-integrated community with enhanced accessibility to health promoting capital. These

findings underscore the positive influence of community-level street-network accessibility upon psychological health and the need for optimizing urban design in this respect.

Among the natural environment variables, slope variability was consistently associated with psychological distress irrespective of the built environment as well as in the fully adjusted model. This may be attributed to reduced physical capacity and mobility of the elderly in a hilly terrain. In a study conducted by Wood et al. (2010), perception of steep hills has been reported to be associated with a 3.36% decrease in the sense of community. That none of the built environment variables were significantly associated with the non-zero GHQ-30 score model in a subset population exhibiting symptoms of psychological distress, is of interest. On the one hand, in the case/non-case threshold model, the hypothesis is that higher slope variability combined with the built environment attributes acts as a disincentive to 'go out' among the psychologically distressed compared to the non-cases. On the other hand, among the non-zero GHQ population, slope variation alone has an influence on the variation in psychological distress level. It seems that the terrain-induced disincentive to 'go out' kicks in for the population subset exhibiting symptoms of psychological distress, thereby rendering them insensitive to built environmental factors.

A statistically significant association between the beneficial effects of greenness and psychological health was also observed to be independent of the built environment; however, the association remained insignificant after the inclusion of built environmental configurational measures. This is fascinating since it suggests that network configuration may be more important than proximity to green space per se.

In the models, income, employment and physical environment domains of area level deprivation were found to be associated with psychological distress, ignoring built environment patterns (model 2). LSOAs having higher deprivation with respect to income and physical environment deprivation domains were associated with higher odds of psychological distress. The physical environment domain index operationizes environment

deprivation through indicators of air quality, air emissions, proximity to waste disposal and industrial sites, and flood hazard. However, higher employment deprivation was associated with lower odds of psychological distress in the elderly. This may be attributed to the fact that the employment domain index is more reflective of social security and benefits. It measures the proportion of working age people claiming out-of-work benefits and comprises indicators of claimants of unemployment benefits, incapacity benefit, severe disability allowance etc. Since the study cohort is largely beyond the legal working age, the finding is along expected lines: the presence of unemployed family and community members entitled to benefits constitute a socially supportive and cohesive environment, having a positive impact upon the psychological health of elderly.

After the inclusion of built environment parameters in the model, only the employment and education domains of deprivation indictors remained significant. LSOAs with higher educational deprivation were associated with higher prevalence of psychological distress. Since employment effects are controlled for, this might indicate an improved ability to cope with psychological distress with increasing levels of educational attainment.

CaPS is a cohort of middle-aged and older men; hence, one must be cautious in generalizing the nature of associations to other sections of the population, particularly on account of differences in individual risk factor profiles between populations e.g. in older women or in younger men. Nevertheless CaPS may be considered a reasonably representative population sample and the data are highly informative for this demographic group. It is important to recognize that the influence of different components of land use configuration on mental health is likely to be complex and may vary not only according to mix and density but also according to the natural and economic environment. For example, CaPS is situated in the South Wales valleys where there is high slope variability and an ongoing post-industrial transition of land use. Under such circumstances it is important to consider the level of generalisability of the observed associations. It may be, for example, that the benefit to mental health of higher local area street accessibility is

more widely generalisable than the inverse association of bus-stop density with mental health. Only further research can address these issues.

# 6.5 Conclusions

The evidence from the study supports the hypothesis that variation in the way the built environment is configured (by design or evolution) has an impact upon the psychological health of older adults. The exact causal mechanisms linking built and natural environments with mental health emerge over time as a result of complex interactions and are likely to be age specific. This necessitates a replication of the present study through a robust prospective design operating at a much larger scale with diverse age groups.

There has been substantial ongoing debate about the implications of sound urban planning and design upon preventive health management. The objective measurements of built and natural environment factors produce much needed scientific tests in support of evidence-based research into holistic public health planning such as urban design and retro-fitting of the built environment in pursuit of health-sustaining communities. The study has specific relevance in local authority planning decisions with respect to optimizing the neighbourhood activity space so as to promote healthy activity behaviour. Such optimization in urban planning and design at a community level may contribute towards devising effective intervention strategies in preventive health. Large-scale studies are required for gathering further evidence to support informed planning decisions.

# Chapter 7: Built environment configuration and change in body mass index: The Caerphilly Prospective Study (CaPS)

# 7.1 Physical inactivity and the epidemic of obesity: Public health impacts

Physical activity has emerged as one of the key determinants of public health in our modernized technology based society. Technological innovations have mechanized most of our daily routine tasks resulting in sedentary lifestyles and unhygienic food habits (such as increased dependence on inexpensive, calorie-dense foods and beverages). The past three decades have witnessed a two-fold increase in the prevalence of obesity (Caballero, 2007) posing serious public health risks. In 2008, approximately 34% of adults (1.46 billion) worldwide were overweight with a Body Mass Index (BMI)  $\geq$  25 Kg/m<sup>2</sup>, of which 502 million were obese with BMI  $\geq$  30 Kg/m<sup>2</sup> (Kimokoti and Millen, 2011). Current trends project 65 million more obese adults in the USA and 11 million more obese adults in the UK by 2030 (Wang et al., 2011).

In the UK, 7.3% of all disability adjusted life years (DALYs) are directly attributable to overweight and obesity, accounting for 66,737 directly related deaths. The direct annual health costs of overweight and obesity to the NHS have been estimated to be around £3.23 billion, while, a separate study attributed £1.06 billion towards the costs of physical inactivity (Allender and Rayner, 2007, Allender et al., 2007). In England, obesity levels have increased from 13.2% in 1993 to 24% in 2008 in men, and from 16.4% to 25% in women over the same period. A greater proportion of men than women (42% compared with 32%) in England were classified as overweight in 2008 (BMI 25 to less than 30kg/m<sup>2</sup>). In the case of adolescents, 16.8% of boys aged 2-15 years, and 15.2% of girls in this age group were classed as obese. Statistics on self reported measures of physical activity

indicate that only 39% of men and 29% of women met the recommended levels of at least 30 minutes of moderate intensity activity at least 5 times a week in 2008 (Eastwood, 2010). Data from the 2004 Canadian Community Healthy Survey indicate that the national prevalence of overweight and obesity among Canadian adults at 36% and 23% respectively (Canadian Institute for Health Information., 2006). The direct and indirect medical costs associated with overweight and obesity in Canada in 2001 was estimated at \$1.6 billion (CAD) and \$2.7 billion (CAD), respectively, accounting for 2.2% of total health care costs (Katzmarzyk and Janssen, 2004, Pouliou and Elliott, 2010a). Australian statistics indicate that only 46.1% of adults and about 45.5% of women were active at moderate to vigorous levels for at least 30 minutes per day on a minimum of 5 days a week (Bauman et al., 2001). A similar trend has been projected for the non-industrialized countries, with an estimation that three guarters of the obese population worldwide will belong to the non-industrialized countries by 2025 (WHO., 2005b). Ziraba et al. (2009) studied demographic and health survey data (collected 1992-2005) from seven African countries and concluded that the prevalence of obesity increased by approximately 35% during the same period. Cross country analysis of data on overweight children and childhood obesity indicates an increasing trend (Wang and Lobstein, 2006).

The bulk of epidemiological evidence highlights the fact that physical inactivity has a significant association with weight gain and obesity (Summerbell et al., 2009). This primarily results from the simultaneous increased calorific intake and decreased calorific expenditures leading to a *positive* energy balance. Physical activity has been known to play a defensive role, offsetting a number of chronic diseases, both independently and via its effects on weight gain and obesity (Miles, 2007). Obesity is associated with increased risk of vascular, metabolic, neoplastic and mental health outcomes (USDHHS., 1996, James, 1998, Kopelman, 2000, Xavier Pi-Sunyer, 2002, Warburton et al., 2006, Flegal et al., 2007, Ogden et al., 2007, Haskell et al., 2009, Wiles et al., 2007).

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Although the impact of obesity on mortality is smaller in the oldest old (85+ years), obesity remains an important predictor of all causes of mortality in older people, being a particularly strong predictor of vascular mortality (Stevens et al., 1998). The projected doubling (11% to 22%) of the older adult population (60+ years) by 2050 will, therefore, likely exacerbate the global obesity problem (WHO., 2007). Furthermore, the health risks posed by obesity are significantly exacerbated by the compositional changes occurring in the body with the ageing process. There is a progressive increase in body fat mass, which usually peaks at the age of 65 years in men and later in women. This is accompanied by a simultaneous loss of muscle mass and decline in muscle strength. This is often termed sarcopenic obesity, a condition that increases the risk of physical disability, morbidity and mortality (Zamboni et al., 2008, Roubenoff, 2004).

# 7.2 The role of built environment

In addition to the inherent physiological, lifestyle, and socio-demographic factors, the built environment has been implicated in explaining the sharp rise in obesity as well as its socio-spatial distribution. The constituent components of the built environment, especially its design and the configuration of land use and street networks, governs the distribution of resources and services, configures the neighbourhood activity space, and thereby influences individual physical activity behaviour and weight outcomes. Enhanced accessibility to health promoting community resources improve local opportunities for physical activity, walking and social interactions and has been linked to reduced body weight (Pearce et al., 2006, Bernard et al., 2007). In a review of several studies that try to assess the associations between physical environment variables and individuals' propensity to use walking and cycling for transport, Saelens et al. (2003b) quantified the extent of association from a physical activity and health perspective. They estimated the mean difference between high- and low-walkable neighborhoods in terms of approximately one to two walking trips per week, which converts to 1-2 km, or about 15-30 minutes more walking per week for each resident in high-walkable neighborhoods. This

amounted to energy expenditure in the range of 3,000-6,000 kcal, or about 0.85-1.75 lb (0.39–0.79 kg) for any 150-lb (68-kg) person. Van Dyck et al. (2010) provided an even higher estimate in European cities – living in a neighbourhood with a high walkability configuration is associated with 80 minutes/week more walking for transport, 40 minutes/week more cycling, 20 minutes/week more recreational walking and 35 minutes/week less motorized transport.

Recent research has highlighted the positive influences of mixed- land use (Frank et al., 2004, Saelens et al., 2003a), green spaces and recreational facilities (Norman et al., 2006, Diez Roux et al., 2007, Wolch et al., 2011, Nielsen and Hansen, 2007, Björk et al., 2008) transit stops (Edwards, 2008, Bassett Jr et al., 2008, Brown and Werner, 2008), supermarkets (Black et al., 2010, Inagami et al., 2006, Morland et al., 2006), and sports facilities (Rutt and Coleman, 2005, Giles-Corti et al., 2003) upon individual weight outcomes. In contrast, street network segments associated with higher connectivity and higher global accessibility, are generally synonymous with higher traffic density and speed, increasing levels of pollution and reduced perception of safety; hence they are associated with higher odds of obesity under the hypothesis that these factors deter walking (Timperio et al., 2005, Jerrett et al., 2010, Boer et al., 2007, Norman et al., 2006). Several measures have been developed to quantify salient parameters of the built environment factors. (Cervero and Kockelman, 1997) introduced the 3D's: density, diversity and pedestrian oriented designs as measures of the built environment that have statistically significant influence upon walking and physical activity. Subsequently, two more D's - destination accessibility and distance to transit stops - were added to make it 5D's (Ewing and Cervero, 2001). Lee and Moudon (2006a) were able to isolate a statistically significant subset of built environment correlates of walking which were grouped as destination, distance, density, and route i.e. 3D + R. To underscore the importance of these effects of the built environment, the term *neighbourhood walkability* has emerged in the recent years, which may be conceptualized as the degree to which

the attributes of the built environment may promote/inhibit walking and physical activity behaviour (Leslie et al., 2007).

The facilitative role of the built environment in influencing weight outcomes is arguably particularly important in older adults. Although they may have more time for leisure activity, they are also likely to have reduced physical capability. Consequently, built environment factors that promote physical activity, especially design, configuration of land uses, presence of walkable destinations in the form of service utilities, aesthetics, and safety may have an enhanced influence on weight outcomes in the elderly. Several crosssectional studies have highlighted the positive association between physical activity levels and accessibility to facilities, parks and green spaces, safety, aesthetics, mixed land uses, traffic volume and street connectivity for older adults (Humpel et al., 2002, Patterson and Chapman, 2004, Li et al., 2005b, Nagel et al., 2008, Berke et al., 2007b, Frank et al., 2010, Gómez et al., 2010). Other studies have established a direct association between obesity and built environmental attributes like land use mix and density of fast food outlets (Li et al., 2008), aesthetics and pedestrian friendly design (Boehmer et al., 2007), and neighbourhood psychosocial hazards (Glass et al., 2006b). Even though these studies provide evidence of association, their cross-sectional designs mean that the cumulative effect of the built environment upon weight outcomes may be underestimated and the possibility of reverse causation cannot be discounted. There exist no long-term longitudinal studies assessing BMI trends of older adults in relation to the built environment. Only one short-term study has been reported. Li et al. (2009a) followed 1,145 men and women aged 50-75 years for one year finding that both weight and waist circumference increase according to frequency of visiting fast-food restaurants.

The hypothesis driving the present study in this Chapter is that the various attributes of built environment influence patterns of individual physical activity behaviour thereby affecting adiposity in older adults. I test this hypothesis using longitudinal data from the Caerphilly Prospective study (CaPS), which has repeatedly measured obesity (Body Mass

Index) over a 12 year period. I test the association of these measurements with a broad range of objectively measured built environmental factors.

# 7.3 Methods

### 7.3.1 Study design

The study was constituted by the living members of the Caerphilly Prospective Study (CaPS) who had participated in the 3<sup>rd</sup>, 4<sup>th</sup> and 5<sup>th</sup> phases of examination and resided within the study area. The third phase of examination (1989-1993) was employed as a baseline, while the latest follow-up (2002-2004) comprised 1225 surviving men aged 65-84 years. Longitudinal BMI data over the period of study were available for 912 individual respondents. However, 70 lived outside the study area, 96 had observations missing on individual level morbidities, and a further 64 individuals had observations missing across life style and socio-demographic variables. Eventually, the study cohort was limited to 684 valid responses distributed over the three time points, across 35 census-defined lower super output areas (LSOAs).

### 7.3.2 Individual level variables

Each phase of the study involved an extensive clinical examination including anthropometry, assessment of blood pressure, electrocardiogram as well as collection of fasting blood samples. Obesity was assessed in terms of Body Mass Index (BMI), calculated as body weight in kilograms divided by height in metre squared. Height was measured in bare feet using a Holtain stadiometer and weight in light clothes was measured using standard scales. Lifestyle, socio-demographic and vascular risk factors were identified from the literature. Occasion-specific life style risk factors included age, alcohol consumption and smoking status. Alcohol consumption was expressed as a continuous variable and measured in ml/week over each time point. Smoking status at each time point was modelled as a three level factor (non-smoker, ex-smoker, and current smoker). Socio-demographic factors comprised marital status, education and social class. Marital status was modelled as a three level factor (married, single, or divorced/separated/widowed), whilst education was modelled as a three level factor (none/apprenticeship, school certificate/higher technical certificate, professional qualification/degree/higher degree). Social class was assessed using the Registrar General's occupational classification (Office of Population Censuses and Surveys and OPCS, 1980) and, was modelled as a two level factor (manual, non-manual). This was preferred to the more recent National Statistics socio-economic classification given the pre-2001 baseline of the present study as well as the predominantly elderly composition of the respondents beyond retirement age. The study further controlled for the impact of six vascular risk factors, as assessed in the most recent examination (myocardial infarction, angina, high blood pressure, high cholesterol, diabetes and mini stroke).

#### 7.3.3 Built environment variables

The theoretical foundations and the variable selection process in the study were guided by epidemiological research evidence relating the built environment, walking behaviour and obesity (Lee and Moudon, 2006a, Papas et al., 2007, Saelens and Handy, 2008, Brownson et al., 2009, Feng et al., 2010). The built environment measures from the *spatial Design Network Analysis for Urban Health (sDNA-UH)* were operationalized within a 1 kilometre street network buffer around an individual respondent's dwelling unit. The initial model-building exercise included iteration and testing for variable selection to obtain a parsimonious model fit using variables of theoretical importance. The following five sets of 16 built environment morphometrics were included in the finally selected models.

#### Land use morphometrics

Land use mix evaluated the degree of heterogeneity of land uses within a defined buffer of 1 kilometer. A five-category land use mix comprising of residential dwellings, retail, community services, business and offices, recreation and leisure was enumerated within each buffer using a method proposed by (Frank et al., 2004, Frank et al., 2006). The densities of walkable service destinations; bus stops, retail, churches, community services, and recreation and leisure amenities were also measured within each buffer.

#### Destination accessibility

This was operationalized in terms of network distances to nearest green space, facility for physical activity and sports, and healthcare facilities. It was thereafter divided in to three categories namely, 0-50 percentile, 51-75 percentile and 76-100 percentile. The bottom 50 percentile of network distance was employed as the reference category in the regression analyses.

#### Topological accessibility of street network

I posit that in an urban space, in addition to the location and density of services, the configuration of the street network determines individual behavioural and cognitive abilities to identify locations and navigate to the services, thus shaping walking, transit behaviour and eventually the accessibility and the social interactions therein. Following Hillier and colleagues, the geometry of urban space can be thought of as comprising three typologies; the linear space in the form of street segments through which people move, the convex space comprising of squares and public spaces through which they interacts and the ever changing visual field through which they perceive the surroundings as they move within space. As discussed in Chapter 5, Hillier proposed the space syntax modeling technique wherein the continuous urban space is configured in to a set of discrete interconnected units (sub-spaces) and the topological connectivity and accessibility of these sub-spaces govern individual's movement within them (Hillier and Hansen, 1984, Hillier et al., 1993, Hillier, 1996, Baran et al., 2008, Cutumisu and Spence, 2009, Vaughan, 2007). Behaviorally meaningful subtleties in street network topology may thus act as a proxy of walking and transit behaviour, eventually influencing body weight and other health outcomes. As has been reported in Chapter 5, to produce a space syntax

model, the OS ITN layer of Caerphilly was first edited and further simplified to produce a road centreline map and subsequently angular segment analysis (Turner, 2007) was then performed in Confeego (Gil et al., 2007). As with the study in the previous Chapter, two graphical measures of topological accessibility - connectivity and betweenness - have been employed in the present study to act as a proxy for the degree of walkability of each street network segment. Betweenness was measured for each street segment with reference to networks defined within defined at multiple catchment radii. After model testing for the study area, three varying radii RN (the longest distance between two segments in the spatial model, in other words encompassing the entire network), R3000 and R1200 metres representing the movement potential at spatial scales of regional, town, and local walkable distances respectively were employed. At a local scale of 1200 metres radii betweenness captures the pedestrian flows (behaviour); street segments with a higher value of betweenness being more likely to be used by pedestrians. While at scales of N, and 3000 metres, the betweenness index becomes an indicator of transit behaviour, high betweenness being synonymous with increased traffic density and congestion.

## Topography

On account of the geographical location of the study area in the Welsh Valleys, a slope variability factor was tested for its influence on BMI; either as an inhibitor of weight gain or as an inhibitor of walking (exacerbating weight gain). The degree of variability in slope within an individual's home range was operationalized as the standard deviation of slope in degrees within a 1 kilometre network buffer of an individual's dwelling.

#### Dwelling level morphometrics

Dwelling level variables comprised the two measures of dwelling-centred density and dwelling type.

#### 7.3.4 Data analysis

A three level mixed-effect longitudinal model was adopted. A longitudinal analysis gives due credence to the dual components of clustering, namely, time and area clustering effects, to obtain realistic estimates (Allman-Farinelli et al., 2009). Time-level withinindividual clustering in the BMI data arise as a result of repeated measures taken at subsequent time points. In addition, there is an area-level clustering which reflects the contextual effects. Level 1 was measurement occasion (time), level 2 was the individual participant and level 3 was the lower layer super output area (LSOA). The study examined the impact of built environment morphometrics upon the repeated measures of BMI over three time points encompassing a period of 12 years. Phase III of CaPS was the baseline point, with phase IV and V, the subsequent time points in the study. Adjustment was made on each measurement occasion for socio-economic and lifestyle factors. The UK Census has defined LSOAs as relatively stable, compact zonal systems with reasonable degrees of homogeneity in shape and social composition. I have therefore taken the LSOAs as the areal units for studying the potential contextual variations in BMI (Bates, 2006). Between-LSOA level clustering in the BMI of individuals residing in the same LSOA may originate on account of sharing a similar set of socio-economic and built environmental conditions. In the analysis the independent effect of the built environment was characterised by the effect of the LSOA after adjustment for socio-economic and lifestyle factors and vascular morbidities.

The fixed component of the model assessed the magnitude, direction and significance of the relationship between the built environment variables and BMI as well as confounders; while the random component measures the inherent correlations in the observations within levels, separating these into individual level and LSOA level random effects. Measurement occasions were nested within individuals and individuals were nested within LSOAs. This class of model therefore estimates the individual changes in BMI by

partitioning the variance in BMI into three components: between-individual variance, between-occasions variance and between LSOA variance.

Standard data quality checks described in Chapter 5 were performed for all variables before their inclusion in the multilevel framework to ensure parsimonious fit. Extreme outliers were removed and standard regression diagnostics plots were run to access the need for data transformations. Standardized z-scores were used for land use mix and topological accessibility variables to enhance the interpretation of results. Model coefficients (beta), robust standard errors, 95% confidence intervals and significance tests were derived for each independent variable. Additional precaution for parsimonious fit was ensured by adjusting the standard errors using the Huber-White sandwich estimator, which is a robust estimator of the variance-covariance matrix of the regression parameters (Williams, 2000, Maas and Hox, 2004). All analyses were conducted using GLLAMM (GLLAMM., 2010) within the Stata 11.2 statistical software package.

# 7.4 Results

The study cohort reported 2052 observations at three time points for 684 individuals distributed over 35 LSOAs. The descriptive statistics of the individual level variables are presented in Table 7.1. Mean BMI in the 3<sup>rd</sup>, 4<sup>th</sup> and 5<sup>th</sup> phases of examination was 26.89, 27.15 and 27.82 Kg/m<sup>2</sup> respectively, while the prevalence of obesity was 16.81, 18.86, and 26.61% respectively. The spatial location of the CaPS respondents and their weight outcomes are shown in Figure 7.1.

	Mean (SD) or Frequency (%)				
Variable name	3 <sup>rd</sup> Examination	4 <sup>th</sup> Examination	5 <sup>th</sup> Examination		
Weight outcomes	·				
BMI in Kg/m <sup>2</sup> (mean, SD)	26.89 (3.45)	27.15 (3.50)	27.82 (3.97)		
Normal (BMI $\leq$ 25 Kg/m <sup>2</sup> )	203 (29.7%)	170 (24.9%)	155 (22.7%)		
Overweight (25 Kg/m <sup>2</sup> $\leq$ BMI $\leq$ 30 Kg/m <sup>2</sup> )	366 (53.5%)	385 (56.3%)	347 (50.7%)		
Obese (BMI ≥ 30 Kg/m²)	115 (16.8%)	129 (18.8%)	182 (26.6%)		
Occasion specific risks					
Age (mean, SD)	61.5 (4.2)	65.2 (4.2)	73.2 (4.0)		
Alcohol consumption (mean, SD)	15.82(19.66)	13.47 (16.93)	5.66 (9.45)		
Smoking status					
Non-smoker	151 (20.1%)	153 (22.4%)	187 (27.3%)		
Ex-smoker	344 (50.3%)	360 (52.6%)	377 (55.1%)		
Current smoker	189 (27.6%)	171 (25.0%)	120 (17.6%)		
Socio demographic variables					
Marital Status (N, %)					
Married	618 (90.4%)				
Single	26 (3.8%)				
Separated/divorced/widowed	40 (5.8%)				
Social Class (N, %)					
Non-manual	256 (37.4%)				
Manual	428 (62.6%)				
Education (N, %)					
None/ apprenticeship	416 (60.8%)				
School certificate/ higher technical certificate	186 (27.2%)				
Professional qualification/degree/higher degree	82 (12.0%)				
Occurrence of vascular morbidities (N, %)					
MI			91 (13.3%)		
Angina			139 (20.3%)		
Diabetes			95 (13.9%)		
TIA			67 (9.8%)		
Hypertension			309 (45.2%)		
High Cholesterol			202 (29.5%)		

**Table 7.1.** Descriptive statistics for individual-level variables (N=684).



Figure 7.1. Spatial location of participants and their 12 year follow-up weight outcome.

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The mean age of the cohort during the 3<sup>rd</sup>, 4<sup>th</sup> and 5<sup>th</sup> phases was 61.52, 65.18, and 73.22 years respectively. There was a moderate change in lifestyle factors over the period of study. Alcohol consumption reduced from 15.82 ml/week in 3<sup>rd</sup> phase to 5.66ml/week in 5<sup>th</sup> phase. Current smokers constituted 27.63% of the population in 3<sup>rd</sup> phase, but 25% in 4<sup>th</sup> phase and 17.54% in 5<sup>th</sup> phase. The level of vascular morbidity in the latest follow-up was 13% having experienced a heart attack; 20% with angina; 45% with high blood pressure; 30% with high cholesterol; 14% with diabetes; and 10% having had a mini stroke.

The description of the built environment predictors included in the model and their basic statistics have been presented in Table 7.2. The study area manifests marked heterogeneity with respect to the built environment, ranging from urban characteristics in the town centre to rural in the periphery. A respondent's dwelling located in a typical urban area with high land use mix near the town centre is shown in Figure 7.2a while, a typical dwelling in a predominantly rural area with low mix is shown in Figure 7.2b. The standard deviation in slope, in degrees experienced within 1 kilometre of individual's dwelling, ranged from 0.996-7.362 reflecting the unevenness of the topography.

 Table 7.2. Built environment predictors included in the model.

Built Environment Morphometrics	Mean (SD)	Range								
Land use morphometrics (per 1km street net	Land use morphometrics (per 1km street network buffer)*									
Land use mix density Retail Church Community services Recreation and leisure facilities Business and offices	0.160 (0.035) 28.583 (28.725) 2.653 (2.116) 11.982 (8.389) 12.698 (5.074) 32.643 (33.776)	0.053 - 0.229 1.405 - 139.090 0 - 12.284 0.997 - 43.570 2.007 - 34.495 0.908 - 129.036								
Destination accessibility (Street network dist	ance in metres from d	welling)**								
Green space Sports facilities Healthcare facilities	504.079 (352.274) 577.212 (314.736) 568.236 (297.749)	8.511 - 1939.012 10.317 - 1648.040 21.028 - 2015.920								
<b>Topological accessibility of streets</b> (measure radii)***	ed for each street seg	ment at varying								
Connectivity Betweenness RNm (all networks) Betweenness R3000m Betweenness R1200m	2.020 (0.172) 3.623 (0.191) 3.008 (0.208) 2.406 (0.175)	1.629 - 2.411 2.919 - 4.228 2.365 - 3.540 1.732 - 2.823								
Topography (Variability of slope within 1 km s	treet network buffer )**	***								
Neighbourhood slope variability	3.26	0.996 - 7.362								
Dwelling level morphometrics (Within 30 m k	ernel of dwelling) ****	*								
Dwelling centred density Dwelling types Detached Semi detached Terraced Apartments	14.149 (6.738) 155 (22.66 %) 299 (43.71 %) 182 (26.61 %) 48 (7.02 %)	0 - 48								
<ul> <li>Land use data was extracted from Ordnance Sur</li> <li>Spatial location of destinations were extracted from</li> <li>Street network was extracted from Ordnance Sur</li> <li>transformed and subjected to space syntax analy</li> <li>at varying radii of capture the effect of multiple ur</li> <li>distance scale (1200m). Thereafter, connectivity</li> </ul>	vey Address Layer 2. om Ordnance Survey Addre vey Integrated Transport N rsis in Confeego. Measured ban scales: city scale (N, 3 and route Betweenness we	ess Layer 2. letwork layer, l for each street segment 000 m), and local/walking ere aggregated at the								

level of a 1 km street network buffer Slope raster was processed from the BlueSky 5 metre resolution DTM). Measured the standard deviation of slope in degrees within 1 km street network buffer Dwelling level data extracted from Ordnance Survey Address Layer 2. Residential density surrounding the dwelling unit (30m kernel). \*\*\*\*

<sup>\*\*\*\*\*</sup> 

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Figure 7.2. Contrasting neighbourhood built environments of Caerphilly.

- a) Dwelling A located in a urban neighbourhood characterized by high density and mix in town centre
- b) Dwelling B located in a rural neighbourhood with a residential outlook located at the town periphery with adjoining agricultural land.
- © Crown copyright database. Derived from UK Ordnance Survey supplied topographic layer and address layer 2.

The results of a sequence of the three-level mixed effects linear regression with individual and LSOA level random effects for BMI are presented in Table 7.3. Fixed effects are presented in the top half of the table, followed by the random effects. Model fit was assessed by -2\*log likelihood, with smaller values indicating a better fit. For the purpose of comparison, model 0 represents the base line model with no built environment and

individual level predictors (see footnote of Table 6.3). In model 1 all five sets of built environment morphometrics predictors are present, while in model 2, adjustments were made for age, socio-demographic (marital status, social class and education) as well as lifestyle (alcohol consumption and smoking) factors. Finally, in model 3, further adjustment was made for the prevalence of vascular morbidities.

The random effects components of the analysis found there to be negligible and nonsignificant heterogeneity between areas once the built environment variable had been added ( $\hat{\sigma}_{u}^{2} < 0.001$ ), although a high degree of heterogeneity between individual was retained after adjustment for other covariates ( $\hat{\sigma}_{u}^{2} = 9.956$ ), The fixed effects component of the model found that the occasion-specific variance ( $\hat{\sigma}_{e}^{2}$ ) in the BMI varied from 1.971 (0.352) in model 0 to 1.958 (0.351) in the final model 3. An occasion-specific intra-class correlation coefficient of 0.164 in the final model implies that 16.4% of the variance in BMI is occasion-specific attributed to the time interval of 12 years. Furthermore, the increments in BMI over the three time points were consistently significant throughout the four models.

In model 1, seven of the sixteen built environment morphometrics were observed to be significantly associated with BMI. Higher land use mix was significantly associated with increasing BMI levels ( $\beta_1$ = 0.402; p = 0.044). The density of the amenities was observed to be inversely associated with BMI levels: retail density ( $\beta_1$ = -0.033; p = 0.014), church density ( $\beta_1$ = -0.315; p = 0.009), recreation and leisure facility density ( $\beta_1$ = -0.086; p = 0.007). Higher city-scale route betweenness at 3000m was associated with improved BMI outcomes ( $\beta_1$ = -1.197; p < 0.001), while local-scale betweenness at 1200m was associated with poorer weight outcomes ( $\beta_1$ = 0.849; p = 0.022). The slope variability factor played a significant role in predicting BMI levels; a higher standard deviation in slope within the defined buffer was associated with improved BMI levels ( $\beta_1$ = -0.327; p = 0.019). Further adjustments for socio-demographic and lifestyle factors found BMI to be associated with alcohol consumption ( $\beta_2$ = 0.006; p = 0.021), smoking ( $\beta_2$ = -0.810; p < 0.001).and social class ( $\beta_2$ = 0.579; p = 0.038), but these made very little material

difference to associations of BMI with the built environment (model 2). Subsequent adjustments for vascular morbidities in model 3 found BMI to be significantly associated with high blood pressure ( $\beta_3$ = 1.113; p < 0.001), and diabetes ( $\beta_3$ = 1.688; p < 0.001). These associations had mild impact on associations of BMI with the built environment with the exception that BMI was now found to be associated with network distance to a sports facility ( $\beta_3$ = -0.815; p = 0.012).

# Table 7.3. Results of three level mixed effects linear regression with individual and LSOA level random effects for BMI in 684 older men in 35 LSOAs.

Variable	Model 0	Model 0		Model 1		Model 2		Model 3	
	β₀ (95% CI)	р	B <sub>1</sub> (95% Cl)	р	B <sub>2</sub> (95% Cl)	р	B <sub>3</sub> (95% Cl)	р	
FIXED EFFECTS Intercept	26.897 (26.56, 27.23)	<0.001	28.751 (26.72, 30.79)	<0.001	28.800 (24.38, 33.23)	<0.001	28.172 (24.20, 32.15)	<0.001	
Land use morphometrics Land use mix (z-score) Bus stop density Retail density Church density Community service density Recreation and leisure density			0.387 (0.01, 0.76) 0.052 (-0.02, 0.12) -0.033 (-0.06, -0.07) -0.315 (-0.55, -0.08) 0.079 (-0.03, 0.19) -0.086 (-0.15, -0.02)	0.044 0.14 0.014 0.009 0.15 0.007	0.358 (-0.01, 0.72) 0.049 (-0.02, 0.12) -0.036 (-0.06, -0.01) -0.337 (-0.58, -0.09) 0.088 (-0.02, 0.20) -0.083 (-0.15, -0.02)	0.05 0.15 0.006 0.007 0.12 0.012	0.348 (0.02, 0.68) 0.047 (-0.02, 0.12) -0.033 (-0.06, -0.08) -0.356 (-0.57, -0.14) 0.088 (-0.01, 0.19) -0.083 (-0.14, -0.02)	0.038 0.18 0.010 0.001 0.09 0.009	
Destination accessibility: Network distance to:									
Green space 50-75% vs. 0-50 % 75-100% vs. 0-50 %			-0.095 (-0.74, 0.55) -0.347 (-1.13, 0.44)	0.77 0.39	-0.049 (-0.68, 0.58) -0.316 (-1.08, 0.49)	0.88 0.42	0.085 (-0.57, 0.74) -0.108 (-0.82, 0.61)	0.80 0.77	
Sports facility 50-75 % vs. 0-50 % 75-100 % vs. 0-50 %			-0.315 (-0.94,31) -0.592 (-1,32, 0.14)	0.33 0.11	-0.290 (-0.86, 0.28) -0.683 (-1.40, 0.03)	0.32 0.06	-0.348 (-0.83, 0.14) -0.815 (-1.45, -0.18)	0.16 0.012	
Healthcare facility 50-75% vs. 0-50 % 75-100% vs. 0-50 %			0.224 (-0.50, 0.94) 0.073 (-0.65, 0.80)	0.54 0.84	0.146 (-0.55,0.85) 0.077 (-0.63, 0.79)	0.65 0.83	0.034 (-0.68, 0.74) 0.048 (-0.65, 0.75)	0.93 0.89	
Topological accessibility of streets (z- score)									
Connectivity Betweenness RNm Betweenness R3000m Choice R1200m			0.240 (-0.13, 0.61) 0.329 (-0.17, 0.83) -1.197 (-1.77, 0.62) 0.849 (0.12, 1.58)	0.20 0.20 <0.001 0.022	0.238 (-0.12, 0.59) 0.273 (-0.21, 0.76) -1.132 (-1.73, 0.53) 0.864 (0.15, 1.58)	0.19 0.27 <0.001 0.018	0.144 -0.20, 0.49) 0.229 (-0.29, 0.75) -1.113 (-1.73, 0.49) 0.857 (0.19, 1.53)	0.41 0.38 <0.001 0.012	

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Topography								
Standard deviation in slope			-0.327 (-0.60, 0.05)	0.019	-0.324 (-0.60, -0.05)	0.019	-0.325 (-0.60, -0.05)	0.021
Dwelling level morphometrics								
Dwelling centred density			0.017 (-0.03, 0.06)	0.45	0.019 (-0.03, 0.06)	-0.41	0.021 (-0.02,06)	0.32
Detached vs. semi-detached			-0.147 (-0.73, 0.44)	0.62	-0.121 (-0.74, 0.50)	0.70	0.096 (-0.49, 0.69)	0.75
Terraced vs. semi-detached			-0.024 (-0.80,0.75)	0.95	0.0002 (-0.75, 0.75)	1.00	0.027 (-0.67, 0.72)	0.94
Apartment vs. semi-detached			-0.648 (-1.75, 0.46)	0.25	-0.528 (-1.61, 0.56)	0.34	-0.653 (-1.81, 0.51)	0.27
Individual confounders								
Age and lifestyle								
Āge					-0.006 (-0.062, 0.050)	0.84	-0.007 (-0.056, 0.041)	0.77
Alcohol consumption					0.006 (0.001, 0.012)	0.021	0.007 (0.001, 0.012)	0.015
Smoking status (ex- vs. non-smoker)					-0.088 (-0.395, 0.218)	0.57	-0.114 (-0.408, 0.181) -0.797 (-1.148	0.45
Smoking status (current vs. non)					-0.810 (-1.188, -0.432)	<0.001	0.447)	<0.001
Socio-demographic factors								
							-1.060 (-2.000, -	
Single vs. married					-0.772 (-1.695, 0.150)	0.10	0.120)	0.027
Widowed/separated. vs. married Social class					-0.124 (-1.158, 0.909)	0.81	-0.206 (-1.052, 0.640)	0.63
Manual vs. non-manual Educational gualifications *					0.579 (0.031, 1.126)	0.038	0.629 (0.154, 1.105)	0.009
None/apprentice vs. school certs					0 331 (-0 178 0 839)	0.20	0 293 (-0 227 0 813)	0 27
None/apprenticeship vs. degree					0.567 (-0.185, 1.319)	0.14	0.385 (-0.505, 1.274)	0.40
Vascular morbidities								
Myocardial infarction (yes vs. no)							-0.160 (-0.717. 0.396)	0.57
Angina (yes vs. no)							0.580 (-0.211, 1.372)	0.15
High blood pressure (yes vs. no)							1.113 (0.665, 1.562)	<0.001
High cholesterol (yes vs. no)							-0.526 (-1.161, 0.110)	0.11
Diabetes (yes vs. no)							1.688 (0.848, 2.529)	<0.001
Mini stroke (yes vs. no)							-0.052 (-0.991, 0.887)	0.91
Time point								
Phase IV vs. Phase III	0.252 (0.172, 0.333)	<0.001	0.252 (0.172, 0.333)	<0.001	0.269 (0.046, 0.491)	0.018	0.276 (0.078, 0.475)	0.006
Phase V vs. Phase III	0.922 (0.722, 1.122)	<0.001	0.922 (0.722, 1.122)	<0.001	0.975 (0.332, 1.618)	0.003	0.999 (0.441, 1.557)	<0.001
Between occasion variance (S.E.)	1.971 (0.352)	-	1.971 (0.352)	-	1.958 (0.351)	-	1.958 (0.351)	-

RANDOM EFFECTS Between individual variance (S.E.) Between LSOA variance (S.E.)	11.201 (0.807) 0.114 (0.099)	-	10.964 (0.760) <0.001 (0.000)	-	10.600 (0.739) <0.001 (0.000)	-	9.956 (0.711) <0.001 (0.000)	-
Model fit statistic -2* Log likelihood	9200.037	-	9180.476	-	9149.967	-	9109.145	-

<sup>a</sup> Education is modelled as 1: None/apprenticeship; 2: School certificate/higher technical certificate; and 3: Professional qualification/degree/higher degree Model 0: Unconditional null model ;

Model 1: Model with only built environment variables (with no level specific predictors); Model 2: Model with built environment variables adjusted for age, socioeconomic and lifestyle factors; Model 3: Model with built environment variables adjusted for age, socioeconomic and lifestyle factors as well as prevalence of vascular morbidities

# 7.5 Discussion

In a representative population sample of older men, a range of built environment morphometrics have been shown in this study to be associated with change in BMI over 12 years. This is the first long-term longitudinal evidence relating the built environment to change in obesity in older people. The built environment factors identified included the walkability of street segments and the street gradient variability.

## 7.5.1 Strengths and limitations

Strengths of the present study include its longitudinal design, innovative assessment of diverse facets of the built environment captured through a set of objectively measured robust morphometrics and the use of a multi-level analysis which enables the assessment of area, individual and chronologically dependent variances. The objective of the study was to analyze the role of sustained exposure to a set of persistent built environmental factors that could plausibly influence weight outcomes with ageing process and a longitudinal design diminished the possibility of selection bias that commonly plague cross-sectional studies. Selective migrations by the CaPS residents to neighbourhoods that promote physical activity within the study area may have been a possibility. Longitudinal design, encompassing a period of 12 years and the extensive adjustments for confounding at multiple levels diluted the problem of migration/reverse causality with respect of the confounding factors. Space syntax modeling enabled the inclusion of street movement potential and walkability in addition to measures of mix, amenity density and network proximity. This addition is of particular importance in studies of older adults in whom physical capacity declines with age. A range of covariates were examined in the analysis to reduce the likelihood of confounding and reverse causation.

Limitations include the assumption that environment conditions had changed little over the study period. This may be regarded as a relatively unimportant potential source of error, however, because of the stability of built environmental parameters over this period of time. Although it is acknowledged that several of the built environmental parameters may have changed slightly over this period, data from the Caerphilly County Borough Council indicate that most of the LSOAs had been well settled and relatively stabilized over the three phases of the study, both in terms of land uses and street network characteristics. Recently, longitudinal studies with similar designs have been reported (Li et al., 2009a, Jerrett et al., 2010, Wolch et al., 2011). Nevertheless, an improvement for future studies would be to overcome the bottleneck of detailed historic land use datasets and look at the effects of changes in built environment parameters over time.

Although I considered a network street buffer of 1 Km to represent the local home range for this age group, there is no standard definition of local home range. Nagel et al. (2008) have considered buffers of 0.25 and 0.5 mile radius; Li et al. (2005b) employed 0.5 mile buffers; Berke et al. (2007b) used circular buffers of 100, 500 and 1000 metres; King et al., (2005) used 1500 metres network buffers, while Li et al. (2008) took census defined spatial aggregates as proxies for neighbourhoods. The use of a 1 Km network buffer in my study was a compromise which took account of the change in age of the cohort during the period of the study.

Although I have adjusted for a range of potential confounders, I cannot exclude the possibility of some residual confounding. That the study is limited to men is a legacy of its initial focus on heart disease. Nevertheless, these finding are likely to be indicative of associations that might be found in older women.

That a set of built environment morphometrics related to neighbourhood walkability remained significant subsequent to individual level adjustments is indicative of a physical activity related mechanism involved in obesity causation. Nonetheless, specific temporal hierarchies and causal pathways of the longitudinal effect of built environment in conjunction with individual level risk factors still remain to be identified. One of the major methodological constraints in the demonstration of such a causal link in built environment research arises on account of the fact that many of the individual-level socio-economic

and obesity risk factors may in reality play a mediatory role rather than being confounders of built environment effects. Future study designs should attempt to capture cross-level interactions that may moderate/exacerbate the effects of neighbourhood accessibility (Diez Roux, 2002, Diez Roux, 2004a, Li et al., 2005a). The causal processes through which the built environmental factors affect health can be can be drawn from evidences of long-term public health and planning interventions and natural experiments such as the longitudinal health effects of large-scale regeneration programs as well as retrofitting the built environment at community and city levels.

### 7.5.2 Interpretation

The results of the study reported in this Chapter are consistent with the hypothesis that the built environment affects adiposity in later life. Several built environment morphometrics considered to be associated with walkability and physical activity were significantly related to individual level variations in BMI. After controlling for individual level lifestyle factors, socio-demographic confounders and morbidities, higher densities of retail land use, churches and recreation and leisure facilities in the vicinity were more likely to lower BMI. The negative association between retail use and BMI levels is consistent with the principles of walkability as retailing acts as an attractor in the built environment; generating more movement (Frank et al., 2003) Similar results have been reported by (Norman et al., 2006, Sallis et al., 2009a). My study not only corroborates these previous findings, but also provides a more detailed analysis of the built environment features that co-vary with BMI.

In the case of the density of recreational and leisure facilities, the results were consistent with previous findings that BMI is inversely associated with accessibility to such facilities (Giles-Corti et al., 2003) and that physical activity is positively associated with the density of recreational facilities (Norman et al., 2006, Diez Roux et al., 2007). The density of churches in the defined buffer was included in the model on the assumption that churches

have a positive effect upon social capital as well as perceptions of neighbourhood satisfaction. They may also capture aspects of land-use pattern centrality not captured in the other measures (it is well known that historic churches form the centres of very long-lived clusters of human activity in Europe).

That higher levels of land use mix were associated with increased levels of BMI appears contrary to the general understanding that a heterogeneous neighbourhood acts as a generator of physical activity leading to reduced BMI (Saelens et al., 2003a, Frank et al., 2004, Li et al., 2008). However, Brown et al. (2009a) concluded that the presence of walkable destinations may be more important in influencing healthy weight outcomes than land use mix *per se*, while, Rutt and Coleman, (2005) and Forsyth et al. (2008) report findings similar to this, with increasing land use mix associated with higher levels of BMI and obesity. This finding may be explained by the underlying negative association between sense of community and land use mix reported in recent Australian studies (Wood et al., 2008, Wood et al., 2010). This is more relevant given that Caerphilly is a semi-urban commuting town characterized by fairly low mix and dwelling density.

Accessibility to green space and health care facility destinations measured by network distance exhibited no significant association with BMI levels. Network distance to sports facilities was significant only with full adjustment (model 3). However, the association was counter intuitive: subjects living at locations in the top 25 percentile of network distance had significantly lower BMI compared to those in the bottom 50 percentile. These findings contradict the general expectation that a non-obesogenic neighbourhood should have a dense network of sports and recreational facilities in its vicinity. In another study, Jilcott et al. (2007) could not establish any significant relationship between network distance to physical activity resource and levels of activity among low income middle aged women. The classification of sports facility in my study included fitness club, club house, golf, golf range, leisure centre, snooker, stables, tennis courts, playing field, sports pavilion, and sports viewing facilities. The direction of observed association may be a manifestation of

the fact that the facilities are localized at specific parts of the town and the usage of a particular type of facility is governed primarily by the intrinsic affinity of an individual towards a particular type of sports facility rather than by the network proximity factor. In other words, I hypothesize that older men at least, are relatively insensitive to distance to local facilities, and that they include recreation in their time budgets and walk to their chosen facility regardless of distance (clearly within a maximum walking time/distance). The result is that men living at greater distances tend, *ceteris paribus*, to have lower BMI. This is a controversial finding particularly worthy of further testing.

Space syntax metrics have long been used to capture configuration and design parameters of urban form (Kashef, 2011). In this study I apply them to understanding health outcomes. Higher local-scale betweenness was associated with poorer weight outcomes while; higher city-scale route choice was associated with improved weight outcomes. Route betweenness at a local-scale of 1200 metres may act as proxy for pedestrian movement and street level crowding. Even though very well connected, streets with high pedestrian density may be associated with a feeling of lack of safety and possibly uncleanliness associated with high pedestrian flows. Furthermore, high local betweenness is associated with a highly gridded street pattern with high intersection density, which in turn, may act as a potential inhibitor of strolling for the old aged on account of the traffic risk at the street crossings. On the other hand, betweenness at a city-scale radius of 3000 metres captures overall city level accessibility to various attractive destinations. This may mean that elderly men living in such locations perceive a wider range of accessible destinations than those in other locations and are more likely to take walks as a result. A recently cross-sectional study conducted in the city of Glasgow. United Kingdom could not establish any evidence of street network connectivity, body mass index and obesity (Ball et al., 2012). The application of space syntax modelling allows the measurement of street network configuration in greater detail. In addition to the conventional connectivity measures, space syntax models can capture the simulated

(implied) counts of movement potential through street segments, thus providing a more realistic prediction of individual activity behaviour.

With respect to topography, higher slope variability was associated with improved weight outcomes; indicating that individuals indulging in walks expend more calories in an uneven topography. Two previous studies have considered the impact of slope on BMI (Rutt and Coleman, 2005) as well as walkability (Lee and Moudon, 2006a), but the present one is the first study to report a significant association, possibly because of the greater slope variance in the study area.

# 7.6 Conclusions

There is an urgent need to trace the nature of relationships between BMI and the built environment over the life course in order to guide effective intervention strategies for controlling obesity and related morbidities. This study provides the evidence for the hypothesis that in older persons, the built environment can contribute to better weight outcomes. The detailed analysis of the built environment used in this study enabled a finer granularity of built environment classification than has been previously possible in population based studies. This highlights the necessity for large-scale population studies in order to be able to influence urban design in a way that optimizes the built environment for the community as a whole. Of particular interest is identifying the impact of the built environment on specific physical activities for particular age groups, allowing the integration of urban planning and public health initiatives.

# Chapter 8: Does accessibility to health promoting services affect self-perceived health, HADS anxiety and depression? Findings from a multilevel analysis of older men in Caerphilly

# 8.1 Introduction

As I have demonstrated in the previous chapters of this thesis, in the recent discourses on place effects on health, several studies have established the facilitative role of accessibility in urban space in influencing individual behaviour and health (Pearce et al., 2006, Bernard et al., 2007). In one of the earliest studies of the impact of physical accessibility on individual behaviour, Horton and Reynolds (1971) conceptualized the notion of action spaces and stressed that the formation of individual action space is governed by socio-economic factors, travel preferences, home locations, cognitive image of the urban environment, duration of residence at a specific area, as well as the objective spatial configuration of the micro-level activity spaces and city as a whole: i.e. a loci of all urban destinations perceived and visited by an individual as a result of day to day activities. In another study of four neighbourhoods of Glasgow differing in socio-economic profile, Macintyre et al. (2002) proposed that one of the key reasons for health inequalities originates as a result differential accessibility to neighbourhood opportunity structures, expressed in terms of access to material and infrastructural resources which included: (i) physical attributes of the environment to which residents of the area are exposed to such as quality of air, drinking water etc; (ii) the presence of health-promoting domestic and occupational environments and (iii) publicly or privately provided services to support daily lives. More recently, Bernard et al. (2007) defined the neighbourhood sociologically in terms of both availability of, and access to, health relevant resources, while

neighbourhood opportunity space emerges in a way that is described using Giddens' structuration theory (1984). The neighbourhood opportunity space has been conceived by Bernard as an environment for accessing resources and emerges as a result of reciprocal interactions between existing social structure and individual residents who act as agents. On the one hand, individual residents act as agents whose diurnal activities produce discernible social structures, while these social structures provide opportunities as well as enforce constraints upon individuals' activity behaviour. According to this model, access to resources in a neighbourhood physical and social environment is governed by four sets of rules encompassing five mutually interactive domains, which in turn, influence individual health and health inequalities. The physical domain constitutes the physical environment and governs the proximity to both positive and negative resources of built and natural environment. The social environment is constituted by the *economic domain* that governs price; the institutional domain, which regulates entitlement to resources; and the local sociability domain and community organization domain, which are governed by bonds of informal reciprocity and valued relationships formed between individuals and communities.

As reviewed in Chapter 4 and 5, a series of empirical studies assessing effects of accessibility to health promoting/inhibiting neighbourhood resources on health have generally tended to parameterize accessibility in terms of indices of density, diversity, destination proximity and street level connectivity (Lee and Moudon, 2006a, Leslie et al., 2007, Diez Roux et al., 2007, Li et al., 2008). In older adults, the health benefits of improved accessibility to health defining neighbourhood resources have been known to originate on account of enhanced levels of mobility and physical activity (Strawbridge et al., 2002, Weuve et al., 2004, Berke et al., 2007b, Berke et al., 2007a) as well as the corresponding enhanced degrees of participation in social and productive activities (Bassuk et al., 1999, Baum et al., 2000, Baum and Palmer, 2002, Glass et al., 2006a, Pollack and von dem Knesebeck, 2004, Richard et al., 2009).

In Chapter 5, I noted that process of urbanization entails a reconfiguration of unstructured, or primitively structured, space into urban places characterized by discrete interconnected and contested sub-spaces wherein, people reside and conduct their daily activities. The urban built environment has a specific design and configuration, each element being characterized by its inherent identity, continuity and enclosure, quality of public realm, ease of movement, legibility, adaptability and diversity (CABE., 2000). The urban places that emerge by design or evolution can be thought of comprising linear subspaces in the form of street segments through which people move, convex spaces comprising squares and public spaces through which they interact and the dynamic visual field through which they perceive their surroundings (Hillier and Hansen, 1984, Hillier et al., 1993, Hillier, 1996). In the present study I propose that the spatial built environment may be hypothesized as an activity plane - a collection of configured health-promoting community resources and opportunity structures with which an individual resident associates information and subjective utility. In response to this information and the values attached, the individual's activity behaviour is influenced. In other words, the distribution of health-promoting community resources and opportunity structures produces a differential social, economic and accessibility gradient between individuals resulting in differential behavioural patterns in terms of levels of physical activity, walking and social interactions, etc. The first objective of the present study is to examine the effects of a broad set of built environmental factors on general and psychological health in older adults. Secondly, any systematic study of the effects of attributes of the built environment on health should entail a detailed examination of the effects of differential accessibility at multiple spatial scales. To the present knowledge of the author, there is no published feasible analytical methodology to capture the chronological and simultaneous impacts of a wide range of urban morphological health correlates at multiple spatial scales. In most studies, built environment attributes are measured for census-defined spatial units such as wards, counties, output areas and consequently, underestimate the effects of detailed spatial variations in services and hence the effects of differential accessibility of an individual's

dwelling with respect to multiple service and facility catchments at multiple spatial scales. The present study thus aimed to assess the potential health effects of differential accessibility at multiple spatial scales. The manner in which neighbourhood level deprivation may potentially moderate the association between built environment factors and health outcomes is also investigated. With this objective in mind, the present Chapter measures both service accessibility as well as street network accessibility at two specific network catchment radii of 0.5 and 1.0 miles.

# 8.2 Methods

### 8.2.1 Study design

The Caerphilly Prospective Study (CaPS) has been following up on the health of a population-based male cohort in the Welsh Assembly constituency of Caerphilly, South Wales for the past 25 years. Further details of the CaPS cohort can be found in Chapter 4. The present analysis is based on the most recent; i.e. the 5<sup>th</sup> phase of examination of the CaPS study that occurred between September 2002 and June 2004. This comprised two pre-clinic questionnaires sent out to the 1225 men remaining in the study and aged 65-84 years, subsequently followed up at an appointment which also comprised extensive clinical examinations.

#### 8.2.2 Health measures and individual level covariates

Self reported measures of health comprised perceived general health, long standing disability and HADS anxiety and depression. Respondents were asked to rate their health status on a five-point scale, comprising categories of 'excellent', 'good', 'fair', 'poor', and 'very poor'. The respondents were asked if they suffered from any long standing illness or disability. The symptoms of anxiety and depression were assessed with the help of Hospital Anxiety and Depression Scale (HADS), a fourteen item self administered standard psychological instrument (Zigmond and Snaith, 1983). The HADS comprises

seven component anxiety (HADS-A) and seven component depression (HADS-D) items each of which are rated on a four point scale and summed up to form the respective subscales. The scores can range from 0-21, with higher scores indicative of more severe psychological disorder. Individual level socio-demographic covariates comprised age, marital status, social class and educational attainment.

#### 8.2.3 Assessment of the built environment

The <u>spatial Design Network Analysis for Urban Health</u> (sDNA-UH) described in detail in Chapter 5 was used to create a set of robust model variables of built environment configurations and individual level covariates. With an objective to assess the impact of accessibility at varying spatial scales, in the present experiment the built environment measures from sDNA-UH were measured within a 0.5 mile and 1 mile street-network catchments around an individual respondent's dwelling unit. Dwelling-level configurations comprised dwelling-centred density, plot exposure and dwelling type. Land use configurations were expressed in terms of density of health-defining services. The densities of public transit (bus stops), retail, community services, recreation and leisure, and business and offices were calculated as the number of units divided by the total area within 0.5 mile and 1 mile street-network buffers respectively.

With an objective to incorporate the effects of varying degrees of street network accessibility to health-specific destinations, the network distances to nearest green space, nearest facility for physical activity and sports, healthcare facility, food takeaway shop and allotment were included in the analyses.

To assess the effects of multi-scalar street network configuration and accessibility upon health outcomes, the <u>spatial Design Network Analysis</u> (sDNA) software described in Chapter 5 was employed. This software became available at the later stage of my writing of this thesis and it was therefore thought appropriate to test it in the third empirical Chapter, both to add to the novelty of the thesis and to explore the method's performance
in this kind of application. The OSM ITN layer of Caerphilly was subjected to network analysis in the sDNA software. As mentioned in Chapter 5, sDNA uses the OS Mastermap ITN network links as the fundamental unit of computation in the graphical analyses, thereby improves upon reliability of measurements due to having an improved and industry standard underlying data structure. Minimum data preparation and a faster algorithm enable faster processing of large scale urban networks (http://www.cardiff.ac.uk/sdna). In the present study, three indices of street network accessibility, namely betweenness, hull area and junction connectivity were modelled within catchments of 0.5 and 1.0 miles. Betweenness measures the through-movement potential, hull area measures the network area encompassing all the constituent origindestination links, while junction connectivity is synonymous with the number of street intersections within a defined catchment.

The composite score of the Welsh index of multiple deprivation (WIMD) for 2005, measured at the level of Lower Super Output Area (LSOA) was employed as a proxy for LSOA level deprivation.

## 8.2.4 Statistical methods

Perceived general health was modelled as a two-level factor. The five-point scale was dichotomised in my analyses into 'fair/poor/very poor' versus 'excellent/good'. Long standing illness/disability was modelled as a two-level factor (presence versus absence). The prevalence of anxiety and depression was also modelled as a two-level factor (case vs. non-case) using the cut-point ( $\geq$  8) which has been confirmed by a previously conducted cohort studies in the UK (Gale et al., 2011).

The individual level covariates of age (years) was employed as a continuous variable. Social class was expressed in terms of six groups following the Registrar General's occupational classification (Office of Population Censuses and Surveys (OPCS), 1980) and thereafter collapsed into a three-level factor (I, II, III-non-manual/ III-manual/ IV, V).

Marital status was modelled as a three-level factor (married, single, widowed/divorced/separated). Educational attainment was also modelled as a three level factor (none/apprenticeship, school certificate/higher technical certificate, professional qualification/degree/higher degree).

Multicollinearity between the built environment variables was checked with the *collin* command for logistic regression in Stata as well as through prior assessment of variance inflation factors (VIFs) before their incorporation into the multilevel modelling framework. sDNA-measured betweenness scores were log transformed using the zero-skewness log transform option in Stata. The area-level variable of Welsh Index of Multiple deprivation was converted into quartiles with the first quartile (corresponding to least deprived LSOAs) taken as the reference category.

The presence of hierarchically clustered data with individuals nested within censusdefined LSOAs enabled the assessment of impact of built environment configuration upon general and psychological health through a series of multi-level logistic regression models. Two-level logistic mixed effects models with LSOA-level random effects were fitted on the health indicators of perceived general health, long standing disability, anxiety and depression. The analysis comprised four models. Model 1 examined the associations of psychological distress with the built environment variables measured within a 0.5 mile network buffer. Model 2 examined the association of psychological distress with the built environment variables measured within a 0.5 mile network buffer subsequent to adjustments for area level deprivation. Model 3 examined the association of psychological distress with the built environment variables measured within a 1.0 mile network buffer while Model 4 considered the further effects of adjustments for area level deprivation. Fixed effects were assessed through odds ratio, a 95% confidence interval and the level of statistical significance ( $\alpha$ ) at p, while model fit was expressed in terms of Bayesian DIC. Statistical analyses were performed with the user-written runmlwin command within Stata 11.2 (Leckie and Charlton, 2011). The command fits multilevel

models from within the MLwiN v.2.25 package using the Markov Chain Monte Carlo simulation (Brown, 2012).

## 8.3 Results

Of the 1127 men who responded to the latest follow-up of CaPS, completed data across all the variables were available for 807 men in the analysis of perceived general health and long standing illness/disability. The analysis of HADS was possible for 677 men after excluding missing responses on each of the model variables. These men were distributed across 33 census-defined lower super output areas (LSOAs) of Caerphilly assembly constituency. The prevalence rate of diminished perceived general health was 47.21%, while, 64.06% reported and long standing illness/disability. The prevalence rates of anxiety (HADS-A  $\geq$  8) and depression (HADS-D  $\geq$  8) were 13.15% and 8.86% respectively. The descriptive statistics of the representative sample including the built environment variables incorporated in the analysis are presented in Table 8.1.

Variable name	Mean (SD) or Frequency (%)	Range
Health measures		
Perceived general health, n (%) (N=807)		
Excellent	39 (4.8%)	
Good	387 (48.0%)	
Fair	301 (37.3%)	
Poor	68 (8.4%)	
Very poor	12 (1.5%)	
Long standing illness/disability, n (%) (N=807)		
No case	290 (35.9%)	
Case	517 (64.0%)	
HADS (N=677) (mean, SD)		
HADS - Anxiety	3.67 (3.57)	0 - 19
HADS - Depression	3.08 (2.86)	0 - 15
Socio-demographics		
Age, Mean (SD)	73.3 (4.1)	65.2 - 83.3
Marital status, n (%)		
Married	728 (90.2%)	
Single	30 (3.7%)	
Separated/divorced/widowed	49 (6.1%)	
Social class, n (%)		
I, II III-non-manual	293 (36.3%)	
III-manual	395 (48.9%)	
IV, V	119 (14.7%)	
Educational attainment, n (%)		

 Table 8.1. Descriptive statistics of variables employed in the mixed effects analysis.

Neve/enventionabie	F01 (C0 10()	
	501 (62.1%)	
	213 (20.4%)	
Degree	93 (11.5%)	
Built environment variables		
Dwelling level variables		
Dwelling centred density, Mean (SD)	14.3 (6.8)	1 - 48
Plot exposure, n (%)		
None	88 (10.9%)	
One building face	560 (69.4%)	
> one building face	159 (19.7%)	
Dwelling type, n (%)		
Detached	173 (21.4%)	
Semi-detached	352 (43.6%)	
Terraced	220 (27.3%)	
Flat	62 (7.7%)	
Network distance to nearest services, Mean (SD)		
Green space	528.1 (307.6)	1.7 - 1654.1
Sports facility	612.4 (318.6)	6.9 - 1652.2
Healthcare facility	560.4 (296.4)	2.8 - 1584
Takeaway	1353.8 (1212.2)	34.2 - 5559.5
Allotment	627.4 (391.4)	4.5 - 1968.9
Service Density, Mean (SD)		
Bus stops 0.5mi	68.6 (20.9)	14.6 - 138.5
Bus stops 1.0mi	55.6 (13.5)	20.4 - 85.8
Retail 0.5mi	74.3 (89.6)	0 - 461.1
Retail 1 0mi	60 2 (43 6)	9.2 - 186
Community services 0.5mi	39.5 (31.1)	0 - 150 1
Community services 1 0mi	31.6 (14.5)	56-742
Becreation & leisure facilities 0.5mi	35.9 (18.1)	0 - 96
Becreation & leisure facilities 1 0mi	29.2 (8.5)	64-74
Business & offices 0.5mi	79 (94 1)	0.4 74
Business & offices_0.5m	74 5 (55 6)	0 - +00.0
Topological accessibility of streets Mean (SD)	74.5 (55.6)	2.3 - 500.2
Potwoonnoon P0 5mi	1 01E ( E 02E ( C)	2 27E 4 2 20E 7
Betweenness R0.5mi	4.01E+0 (3.02E+0)	1 505 5 0 065 9
Live enness n.om	3.19E+7 (3.10E+7)	1.39E+3 - 2.90E+0
Hull area RU.5mi	1.9 (2.2)	0.0 - 127
Hull area R1.0ml	1.3 (0.3)	0.3 - 2.0
	74.8 (36.3)	5.0 - 192.0
Junction connectivity R1.0mi	250.3 (113.9)	31.0 - 585.0
LSOA level deprivation, mean (SD)	(10, 5)	E 0 67 1
01 (most affluent)	23.2 (13.5) 9.1 (1.7)	5.2 - 67.1
Q2	17.3 (2.5)	11 9 - 19 5
03	26.8 (5.0)	20 1 - 34 2
Q4 (most deprived)	42.9 (7.7)	34 4 - 67 1
	76.0 (1.1)	07.7 - 07.1

+ Q: Quartile (Q1, Q2, Q3 Q4 represents the lower, lower middle, upper middle and upper quartiles respectively).

The results of two-level mixed effects models for perceived general health and long standing illness/disability are shown in Table 8.2. Among the dwelling-level variables, a higher dwelling-centred density was consistently associated with better health in the analyses within 0.5 and 1.0 mile catchments ( $OR_{0.5mi} = 0.957$ , p = 0.002 and  $OR_{1.0mi} =$ 0.962, p = 0.006 for perceived general health and  $OR_{0.5mi}$  = 0.973, p = 0.031 and  $OR_{1.0mi}$  = 0.975, p = 0.047 for long standing illness/disability). Residents of flats (apartments) had a higher propensity to report poor health as compared to those living in detached dwellings  $(OR_{0.5mi} = 2.314, p = 0.018 \text{ and } OR_{1.0mi} = 2.333, p = 0.019 \text{ for perceived general health}$ and OR<sub>0.5mi</sub> = 1.844, p = 0.073 for long standing illness/disability). However, in the analysis that used a 1.0 mile buffer, this was no longer significant in the case of long standing illness/disability. None of the variables of destination-accessibility exhibited significant association (p<0.05) with either perceived general health or long standing illness/disability. However, there was a mild association between proximity to green space and propensity to report poor perceived health ( $OR_{0.5mi} = 0.999$ , p = 0.097 and  $OR_{1.0mi} =$ 0.999, p = 0.059 for perceived general health). Among the variables of service density, the density of community services was beneficially associated with long standing illness/disability only in the analysis using a 0.5 mile radius ( $OR_{0.5mi} = 0.992$ , p = 0.053) in model 1. However, adjusting for neighbourhood-level deprivation in the model diluted the level of significance (OR<sub>0.5mi</sub> = 0.992, p = 0.073) in model 2. The density of recreation and leisure was negatively associated with perceived general health only in the analysis using a 1.0 mi radius (OR<sub>1.0mi</sub> = 1.028, p = 0.041) in model 3; however, it was no longer significant subsequent to the adjustment for neighbourhood-level deprivation. In the case of long standing illness/disability, a similar trend of negative associations were observed in models without neighbourhood level deprivation at both 0.5 and 1.0 mile buffer radii  $(OR_{0.5mi} = 1.009, p = 0.052 \text{ in model } 1 \text{ and } OR_{1.0mi} = 1.027, p = 0.031 \text{ in model } 3$ respectively). Among the variables for street network accessibility, higher levels of betweenness at both 0.5 and 1.0 mile catchment radii were beneficially associated with perceived general health ( $OR_{0.5mi} = 0.822$ , p = 0.007 in model 2 and  $OR_{1.0mi} = 0.784$ , p < 0.001 in model 4 respectively). The network hull area was significantly associated with perceived general health only after adjustments for area level deprivation. The analysis at 0.5mile indicated that the association was beneficial ( $OR_{0.5mi} = 0.919$ , p = 0.06 in model 2), while at a scale of 1.0 mile, the association was negative ( $OR_{1.0mi} = 2.211$ , p = 0.09 in model 4). However, neither betweenness nor hull area were significantly associated with long standing illness/disability. The effects of junction connectivity were detrimental to health at a 0.5 mile catchment, but beneficial with a 1.0 mile catchment. In the case of perceived general health, the association was negative and significant at 0.5 mile ( $OR_{0.5mi} = 1.010$ , p = 0.008 in model 1 and  $OR_{0.5mi} = 1.008$ , p = 0.02 in model 2). However, it was positive and significant at 1.0 mile catchment for long standing illness/disability ( $OR_{1.0mi} = 0.997$ , p = 0.08 in model 3 and  $OR_{1.0mi} = 0.997$ , p = 0.05 in model 4).

 Table 8.2
 Results of two-level mixed effects models for perceived general health and long standing illness/disability in 807 older men across 33

 LSOAs.

	Perceived general health			Long standing illness/disability				
Predictors	0.5 mile net	work buffer	1.0 mile ne	twork buffer	0.5 mile network buffer		1.0 mile net	work buffer
	Model 01*	Model 02**	Model 03***	Model 04****	Model 01*	Model 02**	Model 03***	Model 04****
	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p
Dwelling level variables								
Dwelling centred density	0.958 (-0.072,-0.014)	0.957 (-0.074,-0.014)	0.963 (-0.069,-0.008)	0.962 (-0.068,-	0.973 (-0.056,0.003)	0.973 (-0.057,0.001)	0.977 (-0.054,0.005)	0.975 (-0.055,0.004)
	p=0.001	p=0.002	p=0.007	0.008)p=0.006	p=0.039	p=0.031	p=0.056	p=0.047
Plot exposure (one bldg face vs. none)	1.183 (-0.3/1,0.7)	1.1/1 (-0.3/5,0.698)	1.266 (-0.285,0.771)	1.251 (-0.305,0.751)	1.428 (-0.155,0.865)	1.373 (-0.229,0.828)	1.462 (-0.139,0.911)	1.446 (-0.155,0.887)
	p=0.271	p=0.283	p=0.187	p=0.204	p=0.085	p=0.122	p=0.078	p=0.081
	1 209 (-0 409 0 797)	1 198 (-0 423 0 797)	1 220 (-0 384 0 801)	1.213 (-0.398 0.793)	1.038 (-0.538 0.617)	0.980 (-0.624.0.565)	0.979 (-0.603.0.573)	0.967 (-0.615.0.54)
Plot exposure (more than one faces vs. none)	p=0.267	p=0.283	p=0.253	p=0.267	p=0.449	p=0.473	p=0.468	p=0.456
	1.294 (-0.184,0.692)	1.225 (-0.246,0.648)	1.352 (-0.136,0.742)	1.264 (-0.212,0.685)	0.932 (-0.503,0.348)	0.880 (-0.559,0.303)	0.868 (-0.579,0.286)	0.825 (-0.627,0.248)
Dwelling type (semi-detached vs. detached)	p=0.125	p=0.187	p=0.089	p=0.156	p=0.378	p=0.282	p=0.263	p=0.196
	1.345 (-0.248,0.833)	1.294 (-0.292,0.808)	1.363 (-0.229,0.857)	1.293 (-0.305,0.809)	1.233 (-0.334,0.749)	1.150 (-0.402,0.680)	1.094 (-0.456,0.634)	1.058 (-0.494,0.599)
Dwelling type (terraced vs.detached)	p=0.137	p=0.18	p=0.130	p=0.182	p=0.223	p=0.306	p=0.372	p=0.416
	2.376 (0.086,1.657)	2.314 (0.051,1.639)	2.458 (0.122,1.71)	2.333 (0.046,1.66)	2.072 (-0.086,1.541)	1.844 (-0.205,1.448)	1.782 (-0.216,1.425)	1.599 (-0.34,1.291)
Dwelling type (flat vs. detached)	p=0.015	p=0.018	p=0.012	p=0.019	p=0.039	p=0.073	p=0.080	p=0.127
Network distance to nearest services	0.000 ( 0.001 0.0002)	0.000 ( 0.001 0.0002)	0.000 / 0.001 0.0001)	0.000 ( 0.001 0.0001)	0.000 / 0.001 0.0004)	0.000 ( 0.001 0.0005)	0.000 ( 0.001 0.0001)	0.000 ( 0.001 0.0004)
Green space	p=0.08	p=0.097	p=0.041	p=0.059	p=0.19	p=0.302	p=0.042	p=0.166
Sports facility	p=0.215	p=0.161 1.0004 (-	p=0.227	p=0.27	p=0.39	p=0.446	p=0.364	p=0.389
Healthcare facility	1.0004 (-0.0003,0.001)	0.0004,0.001)	1.001 (-0.0002,0.002)	1.001 (-0.0002,0.002)	1.0001 (-0.001,0.001)	0.999 (-0.001,0.001)	1.0001 (-0.001,0.001)	1.0001 (-0.001,0.001)
	p=0.137	p=0.157	p=0.070	p=0.061	p=0.407	p=0.444	p=0.407	p=0.439
Takeaway	0.999 (-0.0002,0.0002) p=0.386	0.399 (- 0.0002,0.0002) p=0.399	0.0004,0.0001)p=0.08 6	0.999 (-0.0004,0.0001) p=0.102	1.000(-0.0002,0.0002) p=0.475	1 (-0.0002,0.0002) p=0.391	0.999 (-0.0003,0.0001) p=0.206	0.999 (-0.0003,0.0002) p=0.352
Allotment	0.999 (-0.001,0.0003)	0.999 (-0.001,0.0003)	0.999 (-0.001,0.0003)	0.999 (-0.001,0.0003)	1.0003 (-0.0002,0.001)	1.0003 (-0.0002,0.001)	1.0002 (-0.0004,0.001)	1.0002 (-0.0003,0.001)
	p=0.218	p=0.212	p=0.198	p=0.223	p=0.134	p=0.142	p=0.281	p=0.247
Service Density								
Density of bus stops	1.004 (-0.005,0.014)	1.003 (-0.007,0.013)	1.001 (-0.025,0.025)	0.995 (-0.031,0.02)	1.002 (-0.008,0.012)	1.001 (-0.009,0.012)	1.013 (-0.011,0.038)	1.017 (-0.006,0.04)
	p=0.183	p=0.275	p=0.475	p=0.343	p=0.366	p=0.422	p=0.153	p=0.078
Density of retail	0.998 (-0.008,0.004)	0.999 (-0.008,0.006)	1.011 (-0.011,0.035)	1.013 (-0.01,0.038)	0.999 (-0.006,0.006)	0.999 (-0.008,0.005)	1.003 (-0.02,0.027)	1.004 (-0.017,0.026)
	p=0.305	p=0.403	p=0.183	p=0.129	p=0.462	p=0.351	p=0.440	p=0.373
Density of community services	p=0.187 1 006 (-0.005 0.017)	p=0.169 1 003 (-0.009 0.015)	p=0.106 1.028 (-0.003.0.062)	p=0.143	p=0.053 1 009 (-0.002 0.020)	p=0.073 1.006 (-0.006 0.017)	p=0.210 1.027 (-0.001.0.055)	p=0.164 1.018 (-0.011.0.045)
Density of recreation & leisure facilities	p=0.163	p=0.306	p=0.041	p=0.100	p=0.052	p=0.161	p=0.031	p=0.101
	1.001 (-0.004.0.005)	1.001 (-0.004.0.006)	0.995 (-0.018.0.006)	0.995 (-0.016.0.007)	1.0005 (-0.004.0.005)	1.002 (-0.003.0.007)	1.001 (-0.011.0.012)	1.0002 (-0.011.0.012)
Density of business & offices	p=0.362	p=0.308	p=0.217	p=0.213	p=0.414	p=0.219	p=0.452	p=0.482
Topological accessibility of streets								
Betweenness	0.789 (-0.468,-0.041)	0.822 (-0.358,-0.031)	0.797 (-0.336,-0.121)	0.784 (-0.368,-0.133)	0.967 (-0.191,0.172)	0.987 (-0.181,0.173)	0.954 (-0.14,0.047)	0.938 (-0.17,0.056)
	p=0.010	p=0.007	p<0.001	p<0.001	p=0.325	p=0.45	p=0.152	p=0.119
Hull area	p=0.134	p=0.06	p=0.142	p=0.09	p=0.179	p=0.132	p=0.223	p=0.099
	1.010 (0.002.0.017)	1.008 (0.0003.0.016)	1.0002 (-0.004.0.004)	0.999 (-0.005.0.004)	1.004 (-0.003.0.012)	1.003 (-0.004.0.011)	0.997 (-0.006.0.001)	0.997 (-0.006.0.001)
Junction connectivity	p=0.008	p=0.02	p=0.442	p=0.444	p=0.134	p=0.211	p=0.083	p=0.052
Socio-demographics								
Age	1.041 (0.008,0.075)	1.034 (0.005,0.06)	1.041 (0.015,0.067)	1.041 (0.017,0.066)	1.008 (-0.031,0.037)	1.006 (-0.027,0.035)	1.009 (-0.016,0.033)	1.004 (-0.022,0.028)
	p=0.008	p=0.010	p=0.004	p<0.001	p=0.275	p=0.367	p=0.216	p=0.370

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Single vs. married Widowed/separated vs. married Social class (III-manual vs. I, II III-non-manual) Social class (IV, V vs. I, II III-non-manual) Education (school cert vs. none/apprentice) Education (degree vs. none/apprentice) LSOA level variables	$\begin{array}{c} 0.645 \ (-1.292, 0.376) \\ p=0.149 \\ 1.224 \ (-0.433, 0.84) \\ p=0.264 \\ 1.417 \ (-0.033, 0.726) \\ p=0.036 \\ 1.977 \ (0.169, 1.205) \\ p=0.004 \\ 0.717 \ (-0.706, 0.033) \\ p=0.039 \\ 0.377 \ (-1.567, 0.391) \\ p<0.001 \end{array}$	$\begin{array}{c} 0.636 \ (-1.308, 0.388) \\ p=0.144 \\ 1.255 \ (-0.413, 0.869) \\ p=0.244 \\ 1.358 \ (-0.074, 0.679) \\ p=0.056 \\ 1.826 \ (0.098, 1.112) \\ p=0.010 \\ 0.710 \ (-0.714, 0.028) \\ p=0.035 \\ 0.371 \ (-1.599, -0.409) \\ p<0.001 \end{array}$	$\begin{array}{c} 0.622 \ (-1.34, 0.362) \\ p=0.134 \\ 1.289 \ (-0.378, 0.891) \\ p=0.217 \\ 1.459 \ (0.005, 0.751) \\ p=0.024 \\ 1.906 \ (0.14, 1.155) \\ p=0.006 \\ 0.722 \ (-0.696, 0.043) \\ p=0.043 \\ 0.381 \ (-1.56, -0.387) \\ p<0.001 \end{array}$	$\begin{array}{c} 0.636 \ (-1.315, 0.392) \\ p=0.148 \\ 1.292 \ (-0.388, 0.898) \\ p=0.217 \\ 1.374 \ (-0.063, 0.702) \\ p=0.052 \\ 1.775 \ (0.061, 1.1) \\ p=0.014 \\ 0.710 \ (-0.713, 0.029) \\ p=0.036 \\ 0.368 \ (-1.609, -0.409) \\ p<0.001 \end{array}$	$\begin{array}{l} 0.755\ (-1.081, 0.539)\\ p=0.249\\ 0.816\ (-0.825, 0.442)\\ p=0.263\\ 1.235\ (-0.163, 0.583)\\ p=0.133\\ 1.301\ (-0.234, 0.776)\\ p=0.152\\ 1.049\ (-0.321, 0.425)\\ p=0.405\\ 0.976\ (-0.560, 0.518)\\ p=0.463\\ \end{array}$	$\begin{array}{l} 0.735\ (-1.107, 0.517)\\ p=0.228\\ 0.816\ (-0.827, 0.436)\\ p=0.263\\ 1.213\ (-0.190, 0.567)\\ p=0.160\\ 1.239\ (-0.298, 0.735)\\ p=0.207\\ 1.045\ (-0.327, 0.425)\\ p=0.410\\ 0.975\ (-0.565, 0.520)\\ p=0.461\\ \end{array}$	$\begin{array}{c} 0.705 \ (+1.15, 0.468) \\ p=0.195 \\ 0.832 \ (-0.812, 0.453) \\ p=0.282 \\ 1.247 \ (-0.161, 0.606) \\ p=0.13 \\ 1.262 \ (-0.284, 0.757) \\ p=0.188 \\ 1.041 \ (-0.339, 0.416) \\ p=0.412 \\ 0.963 \ (-0.577, 0.509) \\ p=0.446 \end{array}$	$\begin{array}{c} 0.718 \ (-1.143, 0.468) \\ p=0.207 \\ 0.822 \ (-0.810, 0.451) \\ p=0.267 \\ 1.215 \ (-0.176, 0.578) \\ p=0.157 \\ 1.226 \ (-0.313, 0.724) \\ p=0.220 \\ 1.039 \ (-0.336, 0.416) \\ p=0.426 \\ 0.964 \ (-0.587, 0.51) \\ p=0.445 \end{array}$
WIMD scores† WIMD (Q2 vs. Q1) WIMD (Q3 vs. Q1) WIMD (Q4 vs. Q1)		1.236 (-0.32,0.805) p=0.223 1.840 (0.064,1.209) p=0.014 1.435 (-0.201,0.964) p=0.108		1.218 (-0.401,0.904) p=0.277 2.139 (0.139,1.504) p=0.007 1.595 (-0.208,1.213) p=0.090		1.283 (-0.247,0.756) p=0.164 1.292 (-0.250,0.768) p=0.160 1.684 (-0.020,1.068) p=0.029		1.198 (-0.318,0.702) p=0.247 1.305 (-0.266,0.807) p=0.163 1.685 (-0.086,1.153) p=0.047
Between LSOA variance (S.E.) Bayesian DIC	0.045 (0.063) 1087.360	0.062 (0.091) 1087.11	0.105 (0.123) 1087.05	0.114 (0.141) 1085.57	0.013 (0.018) 1082.54	0.017 (0.025) 1085.67	0.016 (0.025) 1082.75	0.020 (0.032) 1085.35

Results are expressed as odds ratio, 95% confidence interval and p-value for the mixed effects logistic regression with MCMC method.

+ Q: Quartile (Q1, Q2, Q3 Q4 represents the lower, lower middle, upper middle and upper quartiles respectively).

Model 1: Comprises of analysis with built environmental morphometrics with 0.5 mi catchment and adjustments for individual level socio-demographics

Model 2: Comprises of analysis with built environmental morphometrics with 0.5 mi catchment and adjustments for individual level socio-demographics and neighbourhood level deprivation
 \*\*\*\* Model 3: Comprises of analysis with built environmental morphometrics with 1.0 mi catchment and adjustments for individual level socio-demographics

\* \*\*\*Model 4: Comprises of analysis with built environmental morphometrics with 1.0 mi catchment and adjustments for individual level socio-demographics and neighbourhood level deprivation.

Table 8.3 presents the results of two-level mixed effects models for HADS anxiety and depression. Among the dwelling-level variables, residents of dwellings having one building face exposed to public space consistently had a higher odds of anxiety in reference to those with no building face exposed to public space, at both 0.5 and 1.0 mile catchment analyses ( $OR_{0.5mi} = 2.572$ , p = 0.027 and  $OR_{1.0mi} = 2.742$ , p = 0.017 in model 2 and 4 respectively). However, no significant association was reported with depression. None of the destination accessibility measures were observed to be significantly associated with HADS anxiety and depression. Among the variables measuring service density, the density of bus stops was associated with higher odds of depression only in the analysis using a 0.5 mile catchment ( $OR_{0.5mi} = 1.019$ , p = 0.036 and  $OR_{0.5mi} = 1.021$ , p = 0.018 in model 1 and 2 respectively). The density of recreation and leisure facilities was also associated with higher odds of depression, but only in the analysis using a 1.0 mile catchment ( $OR_{1.0mi} = 1.048$ , p = 0.048 and  $OR_{1.0mi} = 1.043$ , p = 0.074 in model 3 and 4 respectively). Among the variables of street network accessibility, higher levels of betweenness at 1.0 mile catchment radius were associated with lower odds of anxiety  $(OR_{1.0mi} = 0.867, p = 0.042 \text{ and } OR_{1.0mi} = 0.867, p = 0.059 \text{ in model 3 and 4 respectively}),$ while in the case of depression the association was beneficial with both 0.5 and 1.0 mile buffer radii (OR<sub>0.5mi</sub> = 0.759, p = 0.035 and OR<sub>1.0mi</sub> = 0.692, p < 0.001 in model 2 and 4 respectively).

Higher LSOA-level deprivation measured by the Welsh index of multiple deprivation was consistently associated with poorer health outcomes. In reference to the deprivation scores in the lowest quartile (most affluent LSOAs), residents of LSOAs that fall in the third quartile have higher propensity to report poor perceived general health ( $OR_{0.5mi}$  = 1.840, p = 0.014 and  $OR_{1.0mi}$  = 2.139, p = 0.007), while those in the fourth quartile have a higher propensity to report long standing illness/disability ( $OR_{0.5mi}$  = 1.684, p = 0.029 and  $OR_{1.0mi}$  = 1.685, p = 0.047). Those residing in LSOAs that fall in the second quartile reported significantly higher levels of anxiety in the 0.5 mile buffer analysis ( $OR_{0.5mi}$  =

1.937, p = 0.054). However, higher levels of depression were reported in residents of LSOAs that fall in the second (OR<sub>0.5mi</sub> = 3.508, p = 0.026 and OR<sub>1.0mi</sub> = 2.420, p = 0.066) as well as the third quartile (OR<sub>0.5mi</sub> = 4.576, p = 0.01 and OR<sub>1.0mi</sub> = 3.871, p = 0.011).

The random effects component measuring between-LSOA variance consistently indicated small and non-significant heterogeneity in all the health outcomes across the LSOAs.

# Table 8.3. Results of two-level mixed effects models for HADS anxiety and depression in 677 older men across 33 LSOAs.

		HADS - A		HADS - Depression				
Predictors	0.5 mile network buffer 1.0 mile network buffer		work buffer	0.5 mile net	work buffer	1.0 mile network buffer		
	Model 01*	Model 02**	Model 03***	Model 04****	Model 01*	Model 02**	Model 03***	Model 04****
	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p	O.R. (95% C.I.) p
Dwelling level variables								
Dwelling centred density	1.004 (-0.045,0.052)	1.004 (-0.045,0.050)	1.004 (-0.043,0.05)	1.006 (-0.042,0.053)	0.963 (-0.101,0.024)	0.967 (-0.099,0.031)	0.965 (-0.098,0.024)	0.969 (-0.094,0.029)
	p=0.442	p=0.442	p=0.427	p=0.411	p=0.118	p=0.153	p=0.129	p=0.154
Plot exposure (one bldg face vs. none)	p=0.019	p=0.027	p=0.017	p=0.017	p=0.469	p=0.451	p=0.302	p=0.309
	1.959 (-0.392,1.821)	2.001 (-0.41.1.912)	1.822 (-0.489.1.751)	1.878 (-0.434.1.82)	0.727 (-1.477.0.812)	0.755 (-1.441.0.886)	0.688 (-1.539.0.813)	0.723 (-1.471.0.863)
Plot exposure (more than one faces vs. none)	p=0.115	p=0.114	p=0.146	p=0.132	p=0.296	p=0.319	p=0.259	p=0.291
	0.912 (-0.773,0.582)	0.938 (-0.758,0.642)	0.909 (-0.765,0.581)	0.953 (-0.73,0.647)	1.253 (-0.642,1.16)	1.133 (-0.754,1.056)	1.361 (-0.538,1.204)	1.22 (-0.707,1.112)
Dwelling type (semi-detached vs. detached)	p=0.393	p=0.424	p=0.387	p=0.442	p=0.309	p=0.401	p=0.246	p=0.337
	0.644 (-1.355,0.447)	0.630 (-1.353,0.419)	0.590 (-1.401,0.335)	0.598 (-1.417,0.375)	0.607 (-1.716,0.661)	0.531 (-1.827,0.534)	0.526 (-1.822,0.509)	0.473 (-1.973,0.428)
Dwelling type (terraced vs. detached)	p=0.163	p=0.15	p=0.112	p=0.131	p=0.199	p=0.144	p=0.137	p=0.110
	0.683 (-1.67,0.812)	0.667 (-1.664,0.809)	0.647 (-1.663,0.742)	0.671 (-1.668,0.804)	1.823(-0.779,1.948)	1.541 (-1.019,1.866)	2.045 (-0.643,2.098)	1.799 (-0.843,2.01)
Dweining type (nat vs. detached)	p=0.277	μ=0.262	p=0.241	p=0.267	p=0.166	p=0.276	p=0.151	μ=0.206
Green space	0.999 (-0.001,0.001)	0.999 (-0.001,0.001)	0.999 (-0.002,0.001)	0.999 (-0.002,0.001)	0.999 (-0.002,0.001)	0.999 (-0.002,0.001)	0.999 (-0.002,0.001)	0.999 (-0.002,0.001)
	p=0.477	p=0.425	p=0.193	p=0.158	p=0.37	p=0.334	p=0.177	p=0.18
Sports facility	1.0001 (-0.001,0.001)	0.999 (-0.001,0.001)	1.0003 (-0.001,0.001)	1.0003 (-0.001,0.001)	1.0001 (-0.001,0.002)	0.999 (-0.002,0.001)	1.001 (-0.001,0.002)	1.001 (-0.001,0.002)
	p=0.425	p=0.475	p=0.255	p=0.280	p=0.436	p=0.462	p=0.216	p=0.195
Healthcare facility	0.999 (-0.002,0.001)	0.999 (-0.002,0.001)	0.999 (-0.002,0.0005)	0.999 (-0.002,0.001)	0.999 (-0.003,0.001)	0.999 (-0.003,0.001)	0.999 (-0.002,0.001)	0.999 (-0.002,0.001)
	p=0.127	p=0.136	p=0.103	p=0.116	p=0.118	p=0.136	p=0.224	p=0.277
	1.0001 (-0.0002.0.0003)	1.0001 (-0.0002.0.0004)	0.999 (-0.0005.0.0002)	0.999 (-0.0005,0.0002)	0.999 (-0.001,0.0003)	0.999 (-0.001.0.0003)	0.999(-0.001,0.0001)	0.999 (-0.001,0.0001)
Takeaway	p=0.335	p=0.221	p=0.189	p=0.239	p=0.265	p=0.356	p=0.061	p=0.086
	1.0004 (-0.0004,0.001)	1.0004 (-0.0003,0.001)	1.0004 (-0.0004,0.001)	1.0004 (-0.0004,0.001)	1.0002 (-0.001,0.001)	1.0003 (-0.001,0.001)	0.999 (-0.001,0.001)	1.000 (-0.001,0.001)
Allotment	p=0.141	p=0.132	p=0.164	p=0.169	p=0.326	p=0.303	p=0.477	p=0.462
Service Density	1 010 ( 0 007 0 007)	1 012 ( 0 004 0 028)	1 005 ( 0 021 0 041)	1 002 ( 0 022 0 027)	1 010 ( 0 002 0 028)	1 001 (0 001 0 040)	1 009 / 0 039 0 053	1 001 ( 0 046 0 052)
Density of bus stops	p=0.127	p=0.065	p=0.381	p=0.420	p=0.036	p=0.018	p=0.353	p=0.491
	1.003 (-0.007,0.012)	1.004 (-0.007.0.015)	1.002 (-0.033,0.035)	0.997 (-0.039.0.033)	0.999 (-0.015.0.015)	1.000 (-0.016.0.016)	0.994 (-0.049.0.039)	0.997 (-0.052.0.052)
Density of retail	p=0.308	p=0.244	p=0.46	p=0.430	p=0.489	p=0.503	p=0.392	p=0.438
	0.999 (-0.018,0.015)	0.993 (-0.025,0.012)	0.993 (-0.072,0.055)	1.002 (-0.059,0.065)	1.001 (-0.021,0.021)	0.997 (-0.027,0.02)	0.988 (-0.092,0.067)	0.993 (-0.103,0.075)
Density of community services	p=0.437	p=0.226	p=0.402	p=0.484	p=0.468	p=0.409	p=0.38	p=0.448
	0.993 (-0.026,0.01)	0.992 (-0.029,0.011)	1.031 (-0.013,0.074)	1.027 (-0.02,0.071)	1.002 (-0.021,0.025)	0.996 (-0.029,0.021)	1.048 (-0.009,0.103)	1.043 (-0.014,0.102)
Density of business & offices	0.997 (-0.01,0.005) p=0.248	p=0.203 0.997 (-0.011,0.005) p=0.264	p=0.088 1.0004 (-0.018,0.019) p=0.483	p=0.128 1.003 (-0.017,0.022) p=0.360	p=0.429 0.994 (-0.019,0.006) p=0.153	p=0.391 0.995 (-0.019,0.007) p=0.231	p=0.048 1.001 (-0.025,0.024) p=0.467	p=0.074 1.003 (-0.026,0.028) p=0.402
Topological accessibility of streets	P	P	P	P	P			P
Betweenness	0.854 (-0.407,0.057)	0.842 (-0.412,0.084)	0.867 (-0.31,0.017)	0.867(-0.311,0.037)	0.783 (-0.57,0.041)	0.759 (-0.573,0.021)	0.712 (-0.532,-0.124)	0.692 (-0.572,-0.176)
	p=0.082	p=0.084	p=0.042	p=0.059	p=0.046	p=0.035	p=0.002	p=0<0.001
Hull area	1.551 (-4.315,5.508)	1.180 (-5.223,5.122)	2.062 (-0.825,2.411)	1.942(-0.86,2.169)	0.137 (-8.172,4.479)	0.327 (-7.999,5.714)	3.522 (-0.777,3.210)	5.542 (-0.266,3.565)
	p=0.442	p=0.465	p=0.181	p=0.189	p=0.281	p=0.373	p=0.120	p=0.047
	1.002 (-0.014.0.018)	1.003 (-0.014.0.02)	0.998 (-0.008.0.004)	0.998(-0.008.0.003)	1.003 (-0.018.0.022)	0.999 (-0.024.0.021)	0.997 (-0.011.0.005)	0.995 (-0.012.0.003)
Junction connectivity	p=0.383	p=0.338	p=0.245	p=0.213	p=0.396	p=0.462	p=0.241	p=0.119
Socio-demographics								
Age	0.986 (-0.053,0.025)	0.985 (-0.061,0.033)	0.981 (-0.058,0.023)	0.980 (-0.066,0.021)	1.021 (-0.024,0.068)	1.017 (-0.034,0.065)	1.026 (-0.024,0.073)	1.020 (-0.021,0.067)
	p=0.225	p=0.233	p=0.176	p=0.177	p=0.191	p=0.232	p=0.153	p=0.226
	0.945 (-1.599 1.227)	0.976 (-1.559 1.26)	0.809 (-1.767 1.076)	0.820 (-1.775 1.106)	0.293 (-4.583 0.951)	0.323 (-4.277 1.039)	0.249 (-4.511.0.728)	0.276 (-4.425.0.846)
Single vs. married	p=0.497	p=0.512	p=0.402	p=0.417	p=0.176	p=0.198	p=0.129	p=0.155
	1.565 (-0.484,1.303)	1.550 (-0.484,1.279)	1.696 (-0.393,1.37)	1.707 (-0.377,1.377)	0.345 (-3.010,0.411)	0.339 (-3.000,0.422)	0.342 (-3.036,0.42)	0.334 (-3.044,0.399)
Widowed/separated vs. married	p=0.160	p=0.161	p=0.121	p=0.115	p=0.09	p=0.090	p=0.092	p=0.086

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Social class (III-manual vs. I, II III-non-manual) Social class (IV, V vs. I, II III-non-manual) Education (school cert vs. none/apprentice) Education (degree vs. none/apprentice) LSOA level variables	$\begin{array}{l} 1.071 \ (\text{-}0.517,0.657) \\ p=0.412 \\ 1.170 \ (\text{-}0.628,0.91) \\ p=0.342 \\ 0.802 \ (\text{-}0.828,0.357) \\ p=0.232 \\ 0.676 \ (\text{-}1.328,0.489) \\ p=0.197 \end{array}$	$\begin{array}{c} 1.091 \ (-0.522, 0.709) \\ p=0.394 \\ 1.119 \ (-0.697, 0.911) \\ p=0.390 \\ 0.807 \ (-0.822, 0.376) \\ p=0.244 \\ 0.707 \ (-1.293, 0.543) \\ p=0.232 \end{array}$	$\begin{array}{c} 1.056 \ (-0.526, 0.649) \\ p=0.431 \\ 1.095 \ (-0.701, 0.858) \\ p=0.404 \\ 0.804(-0.826, 0.359) \\ p=0.237 \\ 0.739 \ (-1.214, 0.552) \\ p=0.252 \end{array}$	$\begin{array}{c} 1.058(-0.552,0.673)\\ p=0.432\\ 1.084(-0.732,0.876)\\ p=0.417\\ 0.80\ (-0.830,0.360)\\ p=0.233\\ 0.753\ (-1.204,0.577)\\ p=0.270\\ \end{array}$	$\begin{array}{c} 1.396 \ (-0.427, 1.139) \\ p=0.199 \\ 1.488 \ (-0.587, 1.378) \\ p=0.21 \\ 0.441 \ (-1.701, -0.013) \\ p=0.024 \\ 0.071 \ (-5.834, -0.551) \\ p=0.003 \end{array}$	$\begin{array}{c} 1.271 \ (-0.543, 1.073) \\ p=0.284 \\ 1.241 \ (-0.775, 1.208) \\ p=0.335 \\ 0.427 \ (-1.734, -0.051) \\ p=-0.018 \\ 0.068 \ (-5.979, -0.541) \\ p=0.004 \end{array}$	$\begin{array}{c} 1.551 \ (-0.323, 1.232) \\ p=0.136 \\ 1.530 \ (-0.543, 1.395) \\ p=0.195 \\ 0.400 \ (-1.756, -0.097) \\ p=-0.013 \\ 0.078 \ (-5.701, -0.52) \\ p=0.004 \end{array}$	$\begin{array}{c} 1.373 \left( \text{-}0.454, 1.143 \right) \\ \text{p=}0.218 \\ 1.260 \left( \text{-}0.749, 1.218 \right) \\ \text{p=}0.323 \\ 0.376 \left( \text{-}1.864, \text{-}0.153 \right) \\ \text{p=}0.010 \\ 0.071 \left( \text{-}5.838, \text{-}0.539 \right) \\ \text{p=}0.004 \end{array}$
WIMD scores†								
WIMD (Q2 vs. Q1)		1.937 (-0.141,1.525) p=0.054 1.490 (-0.46,1.294)		1.384 (-0.442,1.098) p=0.204 1.19 (-0.692,1.016)		3.508 (-0.005,2.752) p=0.026 4.576 (0.240.3.013)		2.420 (-0.278,2.15) p=0.066 3.871 (0.173.2.651)
WIMD (Q3 vs. Q1)		p=0.184		p=0.340		p=0.01		p=0.011
WIMD (Q4 vs. Q1)		1.075 (-0.84,1.012) p=0.439		0.913 (-0.996,0.786) p=0.425		2.531 (-0.427,2.403) p=0.093		2.140 (-0.480,2.06) p=0.115
Between LSOA variance (S.E.) Bayesian DIC	0.075 (0.126) 566.26	0.093 (0.150) 569.230	0.041 (0.071) 565.90	0.044 (0.087) 570.390	0.397 (0.467) 410.76	0.419 (0.513) 410.040	0.155 (0.258) 411.12	0.189 (0.297) 410.920

Results are expressed as odds ratio, 95% confidence interval and p-value for the mixed effects logistic regression with MCMC method.

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Q: Quartile (Q1, Q2, Q3 Q4 represents the lower, lower middle, upper middle and upper quartiles respectively). Model 1: Comprises of analysis with built environmental morphometrics with 0.5 mi catchment and adjustments for individual level socio-demographics

\*\* Model 2: Comprises of analysis with built environmental morphometrics with 0.5 mi catchment and adjustments for individual level socio-demographics and neighbourhood level deprivation

\*\*\*\* Model 3: Comprises of analysis with built environmental morphometrics with 1.0 mi catchment and adjustments for individual level socio-demographics

\* \*\*\*Model 4: Comprises of analysis with built environmental morphometrics with 1.0 mi catchment and adjustments for individual level socio-demographics and neighbourhood level deprivation.

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## 8.4 Discussion

In a population sample of elderly men the study found that perceived general health, longterm illness/disability HADS anxiety and depression were significantly associated with certain specific attributes of the built environment. The study also found that the associations were moderated by varying the spatial scales at which they were measured as well as by including a measure of neighbourhood level deprivation (Welsh index of multiple deprivation).

## 8.4.1 Strengths and limitations

The main strengths of the present study include detailed and objective assessment of the built environment, application of multilevel modelling as well as the application of a population sample with a high response rate (CaPS). In order to examine the effects of varying degrees of land use and street network accessibility on health, the built environment was measured at network 'influence-catchments' of 0.5 and 1.0 miles. The inclusion of LSOA level Welsh index of multiple deprivation enabled the potential moderating effects of neighbourhood level deprivation to be studied.

The study was able to employ a combination of self perceived measures of health as well as a standard psychometric instrument of psychological health and examine their association with various facets of built environment. The models used to measure general health and long term illness/disability assessed individual's perception about their health; while HADS is a screening test to assess the presence of clinically significant degrees of anxiety and depression employed on patients both in and outside hospital care.

As Chapter 4 discusses, previous studies have employed measures of street connectivity mostly expressed in terms of street intersection density to assess the impact of street level accessibility on health outcomes, especially obesity and physical activity behaviours (Li et al., 2008, Troped et al., 2010). Many other studies have employed

composite indices of neighbourhood walkability (Berke et al., 2007a, Leslie et al., 2007, Van Dyck et al., 2010, Frank et al., 2010) and street level connectivity (Ball et al., 2012) which fail to isolate the effects of specific facets of built environment. To my knowledge this (as well as chapter 6) are the first study examining in detail the effects of various facets of street network accessibility on psychological health of older adults. The application of the *state-of-the-art* sDNA model for generating street network accessibility indices of betweenness, hull area and junction connectivity enabled more accurate assessment of street level accessibility (Chiaradia et al., 2012a, Chiaradia et al., 2012b). The sDNA network model employs the OS ITN street links as the as the fundamental unit of computation. One of the potential advantages of employing standardized ITN street links is that the its able to overcome the so-called *network distortions or noise* often present in the angular segment analysis used in the space syntax analysis and employed in the street network analysis in Chapters 6 and 7.

Limitations of the study include its cross sectional design, which hinders any exploration of causal association, as well as temporal variation in health outcomes. CaPS is a cohort of older men; hence one should be cautious in generalizing the results to other sections of the population of different age group and sex. The study has limited geographical reach constrained to the LSOAs within the Caerphilly assembly constituency, a semi-urban commuting town with low mix and dwelling density located north of Cardiff. It must be stressed that a much stronger effect of urban spatial scales upon health outcomes is expected in more highly urbanized areas.

## 8.4.2 Interpretation

Of the dwelling-level variables, the positive association between perceived health and dwelling-centred density may be explained via physical activity and social capital mechanisms. Previous studies have consistently established beneficial effects of dwelling level density upon outcomes of physical activity (Li et al., 2005b, Lee and Moudon, 2006b,

Troped et al., 2010), obesity (Pouliou and Elliott, 2010b, Burgoine et al., 2011) and walkability (Saelens et al., 2003a). Higher suburban density may also be associated with enhanced density of acquaintanceship, community ties and neighbourhood satisfaction (Talen, 1999). Living in flats has been generally associated with poorer health, especially mental health (Fanning, 1967, Wilkinson and Britain, 1998, Evans et al., 2003). In the present study, the negative association between flats and poorer perceived health in older adults may be interpreted in terms of lack of access to shared outdoor areas, including opportunities to visit the gardens and enjoy the natural views they may afford as well as reduced mobility and social resulting isolation. The negative association between number of building faces exposed to public space and HADS anxiety may be attributed to the unwanted social interactions and lack of privacy in buildings having more exposures to adjacent streets. This is a novel finding not reported elsewhere. In fact, as far as the author is aware, this association has not been measured in any published study.

The positive association between a reduced propensity to report long standing illness/disability and density of community services is along the expected lines. The density of community services may act as a proxy of social care and support. However, the negative association between density of recreation/leisure facilities and self-reported health and HADS is counterintuitive. There may be poor participation in recreation and leisure among the long term ill and psychologically distressed and hence these facilities in the vicinity of respondent' dwellings may rather act as sources of unwanted social contacts or even negative self-evaluation. As observed in Chapter 6, the negative association between bus-stop density and HADS depression was unanticipated. Higher density of public transport routes may act as a proxy for socially deprived micro-scale housing clusters not captured by the WIMD score. They may as well be associated with higher levels of noise pollution and reduced perception of traffic safety among older adults.

Among the street network accessibility variables, sDNA measured betweenness is a significant predictor of perceived general health, and of HADS anxiety and depression. The associations remained mostly beneficial at scales of 0.5 and 1.0 mile. This is equivalent to the results obtained in the case of GHQ-30 in Chapter 6. Such an association may be explained via physical activity and social capital mechanisms. High betweenness accessibility at the fairly local scales of 0.5 and 1.0 mile is synonymous with high movement potential and consequent increased walkability to local services. This may well promote enhanced social connectivity and mutual support amongst the elderly. Network-hull area at 0.5 mile was beneficially associated with perceived general health only after controlling for neighbourhood deprivation but the association was negative at 1.0 mile. This may highlight the importance of close knit and compact community morphology with high local level street accessibility. The negative association between junction connectivity and perceived general health within a catchment of 0.5 mile underscore the negative effects of street intersections in elderly with respect to traffic density, lack of safety while crossing the streets and the propensity to walk around one's neighbourhood when elderly.

The results of controlling for area-level deprivation indicate that higher levels of deprivation are associated with poorer health outcomes as per expectations. That the associations between the various attributes of built environment and health outcomes are slightly affected (both in point estimates and level of significance) points towards a moderating effect of neighbourhood level deprivation. In the models of psychological distress measured by HADS, the beneficial effects of social support and networking in high betweenness areas are further reinforced by simultaneously being in a more deprived area.

The observed differences in point estimates and level of significance when comparing the two scales (0.5 and 1.0 mile) of catchment areas measured, point to the health impacts of differential accessibility. Such impacts may originate from both differential

physical accessibility and differential perceptions of accessibility to health-promotingcapital. For example, if the density of a specific important health promoting resource is high within a 0.5 mile buffer, the physical accessibility to it is enhanced. The same may be the case for perceived accessibility as residents are likely to hold a positive image of the neighbourhood environment. The physical and perceived factors together may contribute to resource utilization within the 0.5 mile buffer and corresponding health benefits. In such a case any increment in the density of the particular service between 0.5 and 1.0 mile catchments may no longer be important, thereby rendering the density measured at 1.0 mile catchment non-significant. Several examples of this phenomenon can be isolated from the statistical models presented. The density of community services within a 0.5 mile catchment remains significantly associated with lower odds of reporting long standing illness/disability, but the association is no longer significant in the analysis using a 1.0 mile catchment. Another example is the case of the association between junction connectivity and odds of reporting long standing illness/disability. Using a 0.5 mile catchment buffer, junction connectivity is related to higher odds of long standing illness/disability but the association is not significant. In the analysis using a 1.0 mile buffer, higher junction connectivity is, however, significantly associated with lower odds of long standing illness/disability. This may be attributed to the fact that at a scale of 0.5 miles, junction connectivity acts as a proxy variable for street level safety and crowding, however, at a level of 1.0 mile catchment, it may measure for degree of street level integration in the neighbourhood (ie measuring greater perceived access to walkable opportunities).

## 8.5 Conclusion

The final study of this thesis has demonstrated associations between objectively assessed built environment measures and mental health for a specific demographic in a specific location. Findings both confirm and elaborate the findings of other studies reviewed in chapter 4. At least one novel finding has emerged – the link between anxiety in elderly men and living in a home that has at least one face abutting public open space.

Future studies need to be conducted on a more heterogeneous population in order to explore this and the other effects reported across diverse age groups and among women. The impact of accessibility to health promoting/inhibiting resources at multiple urban scales needs to be assessed in areas with varying degrees of 'urbanness', especially in large cities and high density inner-city areas. Evidence gathered from this and similar studies are potentially of great use in optimizing the configuration, design and management of built environments to encourage mobility, physical activity, and social connectivity and thereby fostering physical and mental health.

# Chapter 9: Conclusion

The mode of life also of the inhabitants that is pleasing to them, whether they are heavy drinkers, taking lunch, and inactive, or athletic, industrious, eating much and drinking little (Hippocrates 1948: 71-2).

Over the past decade there has been mounting evidence of the significant role played by the myriad attributes of our city's built environments in shaping our health and well-being. It is now been widely recognized that both health outcomes as well as the success of clinical interventions are shaped by the *context*, more precisely, by the attributes of socioeconomic, built and natural environments. This thesis endeavours to examine the basic question - How do physiological, socio-demographic, built and natural environmental factors combine together to produce specific socio-spatial distributions of health in a city? More specifically, does the city's built environment, its configuration, design as well as the distribution of services within it, influence our cognition, behaviour and lifestyle and thereby our health? In the first section of the thesis, I conceptualize the urban health niche as a novel holistic and spatially-explicit paradigm in public health and propose a health niche model of healthy city. I also provide an overview of the scientific research evidence relating built environment attributes to health outcomes. These lay the foundation for the subsequent empirical sections. Based on the proposed paradigm and gathered research evidence, multilevel data sets pertaining to health, socio-economic, built and natural environment have been produced and integrated together to constitute the high resolution database, spatial Design Network Analysis for Urban Health (sDNA-UH). Three empirical studies comprising multilevel cross-sectional and longitudinal models have been presented which examine the association between specific attributes of a built environment and health outcomes.

# 9.1 Recapitulation

*Chapter 1* lays the foundation of the thesis by reviewing the argument that public health concerns need to be reintroduced into urban planning. A sustainable city economizes and optimizes net agglomeration benefits; and in essence is a *healthy* city, which has been designed and planned to support a population with sound health and well-being. The argument is illustrated with the help of a simple model of urban costs and benefits. An economically sustainable city is able to reproduce its main factor of production, viz labour, and this means that it should support the health of its population and various sub-populations. Ideally, the health-supporting effects of a city should yield more than health subsistence of its labour-force: it should yield 'health surplus', ie. health gains that enhance the quality of life. Large cities in the industrial and pre-industrial periods typically did not do this, with urban mortality rates below rural rates. At the present time, there is a new mood and will to configure cities via urban planning and public health interventions to further enhance the urban health surplus. The purpose of this thesis has been to extend and test new scientific tools in pursuit of this goal.

*Chapter 2* traces the evolving relationship between urban planning and public health. It describes the evolution of modern disciplines of town planning, public health and epidemiology in response to complexities and challenges of urban health originating from the industrialization and urbanization during the pre and postwar eras. The Chapter begins by describing early 19<sup>th</sup> century Britain, characterized by the advent of industrialization and urbanization, often resulting in high density settlements with endemic problems of overcrowding, pollution and lack of basic hygiene and sanitation. Significantly higher mortality from infectious diseases in cities than in the rural areas triggered the onset of urban public health as a modern governance and scientific concern. Sanitarians and city planners of the age forged a strong strategic collaboration focusing primarily on preventive population-level interventions for better hygiene. The Chapter goes on to describe the subsequent era of germ theory that focused on individualistic clinical

interventions in the form of vaccines and antibiotics for epidemic control. However, it was around this time that the alliance between public health and urban planning was severed. With the increased pace of urban expansions, the 20<sup>th</sup> century witnessed significant transformations in economic and social landscapes. Public transport systems evolved and brought with them, urban sprawl. Planning concepts including garden city, broadacre city, land use zoning primarily emerged during the period as means to offset the negative health impacts of urban life; especially those pertaining to high density and pollution from industry and traffic. Spatial delineation of neighbourhoods and road hierarchies attempted to engineer better access to basic services and segregate residential areas from sources of pollution. Post Second World War, the economic and social developments as well as advances in epidemiology and clinical medicine meant that etiology of disease tended to shifted from *infectious* to *chronic*, characterized by longer latency and multiple-causality. The Chapter then describes the evolving epidemiological paradigms that have attempted to explain complex disease causality including chronic disease epidemiology, molecular epidemiology and social epidemiology. The necessity of a more holistic and integrated paradigm for explaining disease etiology was highlighted by the description of contemporary more holistic eco-epidemiological frameworks. The Chapter concludes that urban life in the present century has contributed to unhealthy and sedentary behaviour, often manifested by increasing incidences of obesity, cardiovascular disease, and psychological disorders. They all point to the so-called *miasma* of the built environment (a public health concept first popularized in the 19<sup>th</sup> century) and call for an effective reengagement between the disciplines of public health and urban planning.

In cognizance of increasing calls for a holistic approach to health highlighted in Chapter 2, *Chapter 3* conceptualizes the notion of the *urban health niche* as an all-encompassing epidemiological paradigm that links individual, population, spatial and temporal dimensions. The urban health niche is a hypothetical hyper volume that encompasses the epidemiologic triad of person, place and time. Health is thus considered a function of the

spatio-temporal variations in urban health niche wherein the multiple multilevel causal factors and processes are active over space-time coordinates. With the objective of unravelling the black box of *contextual* determinants of health, such a framework essentially incorporates the role of contextual social, built and natural environmental factors of disease causation. Drawing upon diverse strands of research, the health niche framework integrates three basic epidemiological principles: (i) the multilevel spatial scales (micro-, meso- and macro-scales) at which the health-defining processes function, (ii) multiple levels of aggregation at which health is produced, distributed and studied, and (iii) the temporal dynamism in disease etiology from life-stage to life-course. Such a framework not only integrates the various sub-disciplines of epidemiology but also enables identification of causation by capturing the dynamic interactions from micro via meso to macro scales. Subsequently, the Chapter illustrates the effectiveness of the concept of urban health niche with the help of a bottom-up model of the healthy city. It is based on the assumption that the socio-spatial distribution of health in a city selforganized as a result of complex dynamic interactions between multiple, multilevel causal variables. The objective of such a model is to highlight the integrating links between epidemiological research evidence and its dissemination through effective planning and policy interventions.

Following the proposed urban health niche framework, in *Chapter 4*, I conduct a systematic review of epidemiologic literature on the built environment and health. Determinants of health at housing and neighbourhood levels are discussed in finer detail. Discussion of housing-level determinants of physical health include impacts of cold and damp, mould, overcrowding, disrepair and pest infestation, indoor air pollution, lighting and noise. Housing type and floor level, housing quality and overcrowding have been identified as the key built-environment correlates/determinants of mental health. Neighbourhood-level determinants of health comprise indices of density/intensity, diversity, destination accessibility (expressed as accessibility to retail, green space,

recreational facilities and physical activity resources, local food environments), street network morphology and connectivity, access to public transit and active transport as well as pedestrian oriented design. The association between health outcomes and composite measures to capture walkability and environmental quality are also discussed in Chapter 4.

*Chapter 5* presents the principal hypothesis of the thesis, that the configuration of the city, especially the distribution of land uses and design of street networks defines physical connectivity and accessibility to health-promoting-community-resources and thereby influences health variation. Physical access structures, it is hypothesized, influence an individual's activity patterns, mental and behavioural responses as well as social interactions and thereby are associated with health outcomes. With the objective of operationalizing the spatial elements of the urban health niche model in Chapter 3, this Chapter describes in detail what I call spatial Design Network Analysis for Urban Health (sDNA-UH), a high resolution GIS database comprising sophisticated built environment morphological metrics (morphometrics). This has been developed for one of the UK's most closely studied public health laboratories; the assembly constituency of Caerphilly, South Wales, UK (83,600 inhabitants over 114.54 sg km with a density of 727 inhabitants/ km<sup>2</sup>). A systematic methodology was adopted in the construction of sDNA-UH. The choice of metrics was guided by the extensive review of published epidemiological studies on the association between built environmental and health (Chapter 4); and multilevel data were integrated together along micro-meso-macro scales as defined by the urban health niche paradigm of Chapter 3. The Caerphilly Prospective Study (CaPS) constituted the source of anonymized individual health and socio-demographic data. The respondents who participated in the 3<sup>rd</sup>, 4<sup>th</sup> and 5<sup>th</sup> phases of examination and resided within the study area were geocoded. The UK Ordnance Survey Mastermap (OSM) data layers (topographic layer, integrated transportation network layer (ITN) and address layer 2) were employed to construct a set of built environment morphometrics, measured at the dwelling level as well as within multiple street network buffers around geocoded individual dwelling units. GIS based spatial analysis and network models were employed to construct more than 100 objectively measured built environmental morphometrics. The land use morphometrics covered specific and general accessibility measures. Specific measures reflect the access of individuals to specific health promoting and detracting sources and included density, land-use mix and network distance to health destination. General accessibility measures captured systemic connectivity between an individual's home and every other destination. Two specific graph-theoretic metrics were used: closeness and betweenness. This analysis of street network accessibility was conducted using space syntax and its successor technique sDNA analysis, using ITN network data at multiple catchments around geocoded individual's dwelling unit. Indices of natural environment were also used, comprising measures of slope variability and greenness in terms of satellite derived NDVI. Other measures used include an index of area-level deprivation and dwelling-level morphometrics. The Chapter thus aimed at capturing a highly detailed objective assessment of the built environment, with the objective of developing a multilevel data repository to be subsequently employed in the construction of well-formed spatially explicit epidemiological models of built environment-behaviour-health associations.

The relationship between structure of configured urban space in a city and human behaviour and health has long been established. However, few studies have examined the impacts of the built environment configuration upon psychological disorders. *Chapter 6* examines the impact of built environment configuration upon psychological distress and whether such association is moderated by the natural environment and area-level deprivation. Built environment morphological distress as measured by the General Health Questionnaire (GHQ-30). Participants comprised 687 respondents in the Caerphilly Prospective Study, aged 65-83 years, participating in the study's 5<sup>th</sup> examination and for whom there were complete data. Environmental measures comprised GIS-constructed

land use and street network metrics, slope variability and a satellite derived measure of greenness. The study employed a multi-level analytic framework with individuals nested within Lower Layer Super Output Areas (LSOAs). Given that the GHQ scale was semicontinuous with significant proportion of zeros, a two-part multi-level regression model was employed. In the first part, prevalence of psychological distress was modeled as a two-level factor (case vs. non-case) with the help of two-level logistic mixed effects models. In the second part sensitivity analysis was performed upon the subset of the sample exhibiting non-zero GHQ-30 score with the help of a two-level gamma mixed regression model. Subsequent to adjustments for confounding effects, higher degrees of land-use mix (LUM) were associated with reduced odds of psychological distress. Higher density of bus stops and of business and offices was significantly related to increasing psychological distress. Higher local street-network general accessibility ('betweenness') promoted better psychological health. Slope variability was directly associated with increased odds of psychological distress. Sensitivity analysis using the sub-population exhibiting symptoms of psychological distress (non-zero GHQ score) indicated that none of the built environment variables were significant in explaining variation within the subpopulation, while slope variability continued to be significantly associated with higher odds of psychological distress among this group. The findings support the hypothesis that built environment configuration is independently associated with psychological distress. The study thus underscored the need for effective intervention in the planning and design of residential built environments to achieve the goal of health-sustaining communities. The models point to the design factors that should be paid attention to.

There have been very few longitudinal studies assessing obesity trends of older adults in relation to the built environment. *Chapter 7* employed cohort data of the 3<sup>rd</sup>, 4<sup>th</sup> and 5<sup>th</sup> phases of the Caerphilly Prospective Study (CaPS) to present the first long-term longitudinal evidence relating the built environment to change in obesity in older people. Longitudinal trends in BMI were measured at three time points encompassing a 12-year

period. The study constituted 2052 observations at the three time points for 684 participants distributed over 35 LSOAs census areas. Built environment attributes were assessed through five sets of 16 morphometrics derived from the SDNA-UH spatial database developed to implement an urban Urban health niche model for the CaPS cohort. A three-level random effects modelling strategy was adopted wherein measurement occasions were nested within individuals and individuals were nested within LSOAs. BMI was observed to be significantly associated with a number of built environment factors. The study reported that seven of the sixteen built environment morphometrics were significantly associated with BMI. Higher land use mix was associated with higher odds of obesity. The density of the amenities, namely retail, churches, and recreation and leisure facilities were observed to be inversely associated with BMI levels. Among the street network general accessibility variables, a higher city scale street betweenness at 3000m was associated with improved BMI outcomes, while local scale street choice at 1200m was associated with poorer weight outcomes. Higher slope variability, measured as standard deviation in slope within the defined buffer, was associated with improved BMI levels. Controlling for socio-demographic and lifestyle factors and for vascular diseases had negligible impact upon the influence of built environmental factors. A high degree of heterogeneity between individuals was reported subsequent to adjustments for other covariates. The study also found significant occasionspecific variance in the BMI over the 12 year duration. The increments in BMI over the three time points were consistently significant and positive. However, a negligible and non-significant heterogeneity in BMI between LSOAs was observed. The study demonstrated the importance of urban design and planning in devising community public health interventions towards a fit city and the models point to specific urban configuration dimensions that are associated with obesity.

Chapter 8 tested the health effects of differential accessibility of an individual's dwelling with respect to multiple service and facility catchments at multiple spatial scales. The

effects upon general health (expressed in terms of perceived health and disability) and hospital anxiety and depression in older adults of Caerphilly were examined. Built environment measures were derived from the spatial database SDNA-UH and comprised both land use and sDNA-measured street network morphometrics, parameterized within 0.5 mile and 1 mile street-network catchments. Dwelling level density, dwelling type, density of community services, street network movement potential expressed in terms of betweenness index as well as neighbourhood-level deprivation were identified as the significant parameters. The study reported significant differences in point estimates and level of significance when comparing the two spatial scales of 0.5 and 1.0 mile network catchments. It thereby highlighted the health impacts associated with differential physical accessibility as well as differential perceptions of accessibility to health-promoting-capital.

The empirical studies of this thesis thus concluded that different attributes of objectively measured spatial morphometrics of land use and street network configuration effects health outcomes in a population sample of older adults. This lends support to the thesis' principal hypothesis that the built environment influences individual health behaviour and eventually health. The key strengths of the three empirical studies reported, include the comprehensive nature of the data created, compiled and integrated on the basis of a holistic urban health niche model; the use of objectively assessed built environment morphometrics; the distinction between special and general accessibility effects; the distinction between these effects at different spatial scales, and the application of multilevel modelling to capture random effects across space and time. The application of UK Ordnance Survey datasets to extract land use and street network data layers as well as the subsequent GIS and space syntax and sDNA based network modeling also adds methodological novelty to this research. The studies also assessed the moderating effects of natural and social environments.

## 9.2 Future research directions

I foresee several potentially important directions of further research arising from this thesis, especially those with a potential to extend the epidemiological evidence-base of the association between attributes of built environment and health, identifying causality as well as enabling formulation of corresponding evidence-based policy and planning for effective intervention.

From the conceptual standpoint, there is an increasing need for closer collaborations between epidemiologists and urban planners and policy makers for effective public health interventions. Given the increasing focus on contextual variations in health outcomes, the exacerbating/mitigating role of city's built environment must be incorporated in contemporary epidemiological frameworks. This has been highlighted by the proposed *urban health niche* framework. The framework has the potential to structure evidence-based knowledge gathered from epidemiological research into effective urban health policy and interventions.

From a methodological standpoint, future epidemiological studies of contextual effects of the attributes of built environment on health should make more extensive application of emerging spatial analysis techniques to create detailed objective assessment of the built environment. As has been highlighted throughout this thesis, emerging spatial modelling and network analyses techniques have significant potential to contribute in the domain of spatial epidemiology by adding greater validity and reliability in such studies. A more reliable model of socio-spatial distribution of health is a holistic one; one that includes not only genetic, physiologic, life style and social factors but also the built and natural environmental factors that shape behaviour and channel the interactions between exogenous and endogenous influences on health. Of special importance is the need to develop a perceptional behavioural theory – about how the built environment directly or indirectly modifies behaviour, lifestyle and social interactions and thereby health.

At the same time, it has to be acknowledged that such environment - health model generally tend to have low explanatory power in capturing the unexplained variances in health. A more all-encompassing model of chronic disease should essentially control for underlying genetic pre-dispositions in addition to environmental and behavioural factors. In the recent years, gene-environment (G-E) interaction models studying variances in disease after controlling for genetic variant and a set of environmental exposures have gained predominance (Hunter, 2005, Manolio et al., 2006). Genome-wide association studies (GWAS) have already provided considerable insights in to the genetic and epigenetic complexities underlying chronic diseases by identifying the susceptibility loci for diverse variety of traits (http://www.genome.gov/26525384). Introducing environmental risk factors within GWAS has the potential for robust causal inference; especially in terms of how the environment may play a role in modifying genetic risks. The simplest and commonly employed G-E model is a logistic regression model (Mukherjee et al., 2012):

Logit 
$$P(D = 1 | G, E, S) = \beta_0 + \beta_G G + \beta_E E + \beta_{GE} (G X E) + \beta^T S$$

where G = 0, 1, 2 is the number of alleles present at a biallelic locus, G is the genetic main effect, E is the environmental exposure (which can again be a function of built, social and natural environmental risks) and **S** is a set of all other covariates one may adjust for.

Furthermore, the validity of the strength and significance of associations in most studies may be further enhanced if corresponding retrospective data on health-influencing lifestyle and behaviour can also be collected and adjusted for to take care of their potentially confounding affects. In other words, in addition to the inclusion of measures of density of services and physical accessibility in epidemiological models, survey data on actual service utilization, objectively assessed physical activity (including within-household activity, transport and leisure activity measured through accelerometry), eating behaviour (in terms of consumption of fresh versus fast food and calorific values) have the potential to enhance the methodological rigour of studies.

Also, studies are needed that employ a life course approach to health for more reliable evidence (Ben-Shlomo and Kuh, 2002). In this direction, longitudinal study design would comprise not only prospective data on health and socio-demographic variables, but retrospective spatial data on built and natural environment, compiled and integrated at individual and neighbourhood levels. Such longitudinal designs have the capacity to some extent the potential effects of selective migration and self selection of locations catered by specific community resources.

In a nutshell studies prospective G-E studies have the potential to produce more reliable assessment of the health-impacts of sustained environmental exposures, both in terms of significant increments in explanatory power as well as causal inference (Collins, 2004, Manolio et al., 2006, Manolio and Collins, 2010, Manolio et al., 2012). The UK Biobank is an example of a large-scale national resource which opens the door for such large scale prospective G-E studies to unravel the interactions between genetic and environmental risks in disease etiology. It is comprised by more than 500,000 individuals aged 40-69 years and living within 25 miles from any of the 21 study assessment centres (UK Biobank., 2007, Collins, 2012).

Studies assessing the associations between neighbourhood built environment and health outcomes have generally depended upon regression based approach that essentially try to provide insights into complex interrelations between causal factors by identifying regularities (*the line of best fit*) from a cloud of data points. Advanced statistical regression based techniques such as multilevel modelling and discrete regression improve upon earlier regression approaches (linear, continuous, single level etc) and can, as I have shown, identify multilevel variances of contextual factors in both spatial and temporal domains. Nonetheless, causal inference in neighbourhood built environment - health studies still remains a considerable challenge. This is constrained primarily by the inherent systemic complexities operating in the public health domain. As highlighted in my *urban health niche* model, multiple multilevel factors including physiological, genetic, social,

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behavioural, built and natural environmental may interact dynamically over time to produce health patterns in individuals and populations. Any one statistical approach will inevitably fail to take in to account such dynamic, often non-linear and reciprocal interactions (Galea et al., 2010). Other bottlenecks to unraveling causality include selective migration, cross-level interactions as well as the confusion with mediating versus confounding effects of many of the individual and lifestyle levels variables of regression (Diez Roux, 2002, Diez Roux, 2004a). Such limitations in identifying disease etiology may possibly be overcome by employing more explicitly complex approaches such as agentbased complex adaptive systems models (Auchincloss and Diez Roux, 2008, Galea et al., 2010, Pearce and Merletti, 2006) and dynamic equation models (Homer and Hirsch, 2006).

As a concluding thought experiment, a coupled four-tier suite of epidemiological models may be employed for a more accurate interpretation of causation, somewhat along the lines of the one propose by Auchincloss and Diez Roux (2008). The first tier should comprise regression models on a large-scale (large n) to identify the lines of fit and the determining variables. With large n models fitted to survey data we can recover the kind of weak but significant effects that we would predict of built environment factors. A second tier would comprise multi-level and structural equation models that aim to measure contextual and temporal variability and to add insights into causal pathways. Agent-based complex adaptive system models would constitute a third tier, deriving their inputs from the second tier of models. The main function of these individualistic models would be to conduct exploratory iterations and subsequent optimization of causal network pathways along which the multiple multilevel health-defining agents function. Such models would identify spatial *urban health niches* as a basis for making informed and targeted policy decision. Software for agent based modelling (Gilbert, 2007) such as REPAST, SWARM, MASON may be customized for specific epidemiological applications. Drawing their inputs from the third tier, the differential equation based dynamic equation models in the

uppermost tier would be used to simulate population-level processes, thereby providing deeper insights into the formation of *coalesced health niches*.

Another way to overcome these methodological challenges associated with effective causal modeling of urban health niches would be to devise case-control study designs with the objective of assessing the beneficial/detrimental effects of specific built environment attributes upon vulnerable versus normal individuals.

Another approach advocated by some authors is to conduct randomized controlled trials in order to study the health effects of differential built environments (Oakes, 2004). Although cost, logistics, politics and ethics make such designs problematic in practice, it may be that in certain circumstances they can be specifically employed at smaller scale to study the effects of different built environment configurations in rehabilitation and recuperation of multiple populations with varying degrees of disease prevalence. Another comparatively more practical approach to study the health impacts of different built environments is to conduct prospective within-city between-neighbourhood and betweencities regional-level studies, including natural experiments testing before and after interventions.

## 9.3 Policy impacts to diverse stakeholders

## Urban planners and designers

From an urban planner's and designer's perspective, the challenge is to devise effective planning and design interventions that may improve the health of the city's residents. This lies at the heart of modern city planning. In this regard, the empirical Chapters of my thesis highlight the fact that there are weak, but nonetheless *significant* policy-relevant effects of attributes of built environment configuration on health. Urban planners will increasingly need robust evidence from studies as the one in this thesis in defending their interventions in the face of austerity in government services. Planning and design

interventions may be range from effective inner city regeneration to retrofitting and optimization projects.

- The distribution and siting of the health promoting community resources in the urban matrix may be planned so as to make them more accessible to dwelling locations. Based on evidences provided by empirical of built environment - health studies, both the mix as well as density of land uses can be optimized.
- Evidence base collected on the potential health impacts of local and regional scale street- level accessibility may be used for optimizing an appropriate ratio of local and regional accessibility. Dwelling locations adjacent to major streets may be shielded to minimize or offset the negative health impacts, especially those related to traffic induced air and noise pollution through appropriate green buffers. Also, on the basis of empirical evidence related to potentially negative impacts of certain land use choices, appropriate masking strategy should be followed.
- Street links associated with high local scale syntactic accessibility and hence, a higher potential to support pedestrian density may be specifically targeted for further improvements with an aim to enhance neighbourhood walkability and social connectivity. In this regard, retrofitting with improved design features and pedestrian infrastructure including nature and quality of sidewalks, a high proportion of dwelling block faces exposed to sidewalks, presence of traffic calming features and speed impediments as well as enhancements in aesthetic aspects may all have positive effects upon healthy activity behaviour.
- Optimizing residential densities as well as maintaining an appropriate mix of household types.
- As a preventive approach to geriatric health, care homes for the vulnerable old and handicapped should be planned in optimized locations (in the vicinity of health promoting services) with a view to encourage healthy activity behaviour, social connectivity as well as to create an improved perception of community satisfaction.

Such evidences may be employed to further optimize spatial planning and design of cities, with respect to location of health-influencing facilities as well as geometric accessibility to them.

At the same time, larger scale studies are needed to extend these findings and those of the other studies that I have reviewed throughout this thesis. The UK Biobank spatial DNA Project, mentioned earlier is an example of an ambitious large-scale study aimed at objectively assessing the built environment through series of robust morphometrics for around 500,000 individual respondents (the author is a co-investigator on this project that commences in June 2013).

### Health economists

Health economists should undertake to model the economics of health-sustaining design based on the research evidence provided by the studies contained in this thesis. Monetization of the health benefits of physical accessibility and walkability may have the potential to implement more informed preventive health interventions. The importance of *price tagging* neighbourhoods has been highlighted by Webster (2010):

"So a master-planned community, or gated community or science park or shopping mall is marketed as a bundle of rights to specific commodities - layout and configuration of land uses; type of neighbour; level of services; set of facilities; and so on. Packaging also involves labelling, and these kinds of neighbourhood are marketed using strong themes, images and metaphors. Commoditised neighbourhoods have two advantages over the non-managed neighbourhood".

There is no reason why health enhancing attributes should not be similarly packaged and provided as a consciously marketed attribute of a neighbourhood with an appropriate price tag - as is becoming the case in the various version of elderly peoples' neighbourhoods being developed in the USA, China, Australia and elsewhere.

More generally, a health economics analysis of built environment effects could go one step beyond the typically rather general and tentative design advice coming from government programmes to promote healthy urban planning providing, for example, useful benchmarks for health risk valuations of unsustainable neighbourhood design. Following Webster's (2010) idea that pricing accessibility will generate more of it, pricing health-related accessibility will, in principle, induce the property market to produce more healthy neighbourhoods as local authorities and property developers make capital gains from *health-sustaining design*, (both in terms of premium paid by buyers and health costs saved by).

### Public health professionals

Continuing the idea of fiscal and price incentives, public health professionals could use the kind of evidence-based criteria developed in this thesis to design incentives aimed at encouraging individuals prone to sedentary behaviour to adopt more healthy lifestyles. This may be either in the form of policies regarding density of alcohol outlets and fast food restaurants within a neighbourhood, optimizing unit price of alcoholic drinks, appropriate incentives for actual usage of physical activity facilities by obese individuals, etc. The studies contained in this thesis may form the basis for further research pertaining to the nature and extent of public health intervention needed among less accessible communities and the potential interaction effects between accessibility and deprivation upon health.

## Government ministers and investors

The empirical evidence between built environment and health outcomes may act as a benchmark for guiding government ministers and investors in devising more efficient policies, streamlining the already existing ones as well as making smarter investments. The policies of land use, transport, environment and public health may be further streamlined to include considerations pertaining to health and well being. As an example, the physical accessibility at multiple spatial scales may have an impact upon health and

behaviour both directly as well as indirectly through differential perceptions of accessibility to health-promoting-capital. Thus, evidences from such studies may be employed to guide policies with respect to local authority and regional level planning decisions. Similarly, decisions regarding man power and capital investments by government ministers and businesses can be made *smarter* by following a preventive approach - with focus at the onset on minimizing or offsetting detrimental health impacts of unsustainable built environment design, so that net costs incurred can be minimized; especially those in the form of exorbitant treatment costs.
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## Appendices

Appendix 1: Items of the General Health Questionnaire (GHQ-30) scale\* (Huppert et al., 1989) pg. 179.

SI. No. Items

- 1. Could not concentrate
- 2. Lost sleep
- 3. Restless nights
- 4. Not busy or occupied
- 5. Not out of the house
- 6. Not managing well
- 7. Not doing things well
- 8. Not satisfied with task
- 9. No warmth and affection
- 10. Could not get on with others
- 11. Not chatting with others
- 12. Not playing a useful part
- 13. Could not make decisions
- 14. Felt under strain
- 15. Could not overcome difficulties
- 16. Found life a struggle
- 17. Not enjoying activities
- 18. Taking things hard
- 19. Scared or panicky
- 20. Could not face problems
- 21. Felt everything on top
- 22. Unhappy or depressed
- 23. Lost confidence
- 24. Felt worthless
- 25. Felt life hopeless
- 26. Not hopeful about future
- 27. Not feeling happy
- 28. Nervous and strung up
- 29. Felt life not worth living
- 30. Nerves too bad

\* Each of the items were assessed on a four-point scale and added together to produce the overall GHQ-30 score.

## Appendix 2: Items of the Hospital Anxiety and Depression (HADS) scale (Moorey et al., 1991) pg. 257.

Anxiety items	Depression items
1. I feel tense or wound up	2. I still enjoy the things I used to enjoy
3. I get a sort of frightened feeling as if something awful is about to happen	4. I can laugh and see the funny side of things
5. Worrying thoughts go through my mind	6. 1 feel cheerful
7. I can sit at ease and feel relaxed	8. I feel as if I am slowed down
9. I get a sort of frightened feeling like 'butterflies' in the stomach	10. I have lost interest in my appearance
11. I feel restless as if I have to be on the move	12. I look forward with enjoyment to things
13. I get sudden feelings of panic	14. I can enjoy a good book or TV programme