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# Association between the *LRP1B* and *APOE* loci and the development of Parkinson's disease dementia

Raquel Real,<sup>1,2,3</sup> Alejandro Martinez-Carrasco,<sup>1,2,3</sup> Regina H. Reynolds,<sup>3,4</sup>  
 Michael A. Lawton,<sup>5</sup> Manuela M. X. Tan,<sup>6</sup> Maryam Shoai,<sup>3,7,8</sup> Jean-  
 Christophe Corvol,<sup>9,10</sup> Mina Ryten,<sup>3,4,11</sup> Catherine Bresner,<sup>12</sup> Leon Hubbard,<sup>12</sup>  
 Alexis Brice,<sup>9,10</sup> Suzanne Lesage,<sup>9,10</sup> Johann Faouzi,<sup>9,13</sup> Alexis Elbaz,<sup>14</sup>  
 Fanny Artaud,<sup>14</sup> Nigel Williams,<sup>12</sup> Michele T. M. Hu,<sup>15,16</sup> Yoav Ben-Shlomo,<sup>5</sup>  
 Donald G. Grosset,<sup>17</sup> John Hardy<sup>3,7,8,18,19,20</sup> and Huw R. Morris<sup>1,2,3</sup>

Parkinson's disease is one of the most common age-related neurodegenerative disorders. Although predominantly a motor disorder, cognitive impairment and dementia are important features of Parkinson's disease, particularly in the later stages of the disease. However, the rate of cognitive decline varies among Parkinson's disease patients, and the genetic basis for this heterogeneity is incompletely understood.

To explore the genetic factors associated with rate of progression to Parkinson's disease dementia, we performed a genome-wide survival meta-analysis of 3923 clinically diagnosed Parkinson's disease cases of European ancestry from four longitudinal cohorts. In total, 6.7% of individuals with Parkinson's disease developed dementia during study follow-up, on average  $4.4 \pm 2.4$  years from disease diagnosis.

We have identified the *APOE*  $\epsilon 4$  allele as a major risk factor for the conversion to Parkinson's disease dementia [hazard ratio = 2.41 (1.94–3.00),  $P = 2.32 \times 10^{-15}$ ], as well as a new locus within the *ApoE* and APP receptor *LRP1B* gene [hazard ratio = 3.23 (2.17–4.81),  $P = 7.07 \times 10^{-09}$ ]. In a candidate gene analysis, *GBA* variants were also identified to be associated with higher risk of progression to dementia [hazard ratio = 2.02 (1.21–3.32),  $P = 0.007$ ]. CSF biomarker analysis also implicated the amyloid pathway in Parkinson's disease dementia, with significantly reduced levels of amyloid  $\beta_{42}$  ( $P = 0.0012$ ) in Parkinson's disease dementia compared to Parkinson's disease without dementia.

These results identify a new candidate gene associated with faster conversion to dementia in Parkinson's disease and suggest that amyloid-targeting therapy may have a role in preventing Parkinson's disease dementia.

- 1 Department of Clinical and Movement Neurosciences, UCL Queen Square Institute of Neurology, University College London, London WC1N 3BG, UK
- 2 UCL Movement Disorders Centre, University College London, London WC1N 3BG, UK
- 3 Aligning Science Across Parkinson's (ASAP) Collaborative Research Network, Chevy Chase, MD, 20815, USA
- 4 Genetics and Genomic Medicine, UCL Great Ormond Street Institute of Child Health, University College London, London WC1N 1EH, UK
- 5 Population Health Sciences, Bristol Medical School, University of Bristol, Bristol BS8 2PS, UK
- 6 Department of Neurology, Oslo University Hospital, 0424 Oslo, Norway
- 7 Department of Neurodegenerative Diseases, UCL Queen Square Institute of Neurology, University College London, London WC1N 3BG, UK
- 8 UK Dementia Research Institute, University College London, London WC1E 6BT, UK

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- 9 Sorbonne Université, Institut du Cerveau - Paris Brain Institute - ICM, INSERM, CNRS, 75013 Paris, France  
 10 Assistance Publique Hôpitaux de Paris, Department of Neurology, Hôpital Pitié-Salpêtrière, 75013 Paris, France  
 11 NIHR Great Ormond Street Hospital Biomedical Research Centre, University College London, London WC1N 1EH, UK  
 12 Institute of Psychological Medicine and Clinical Neurosciences, MRC Centre for Neuropsychiatric Genetics and Genomics, Cardiff University, Cardiff CF24 4HQ, UK  
 13 Centre Inria de Paris, 75012 Paris, France  
 14 Centre for Research in Epidemiology and Population Health, INSERM U1018, Team 'Exposome, Heredity, Cancer, and Health', 94807 Villejuif, France  
 15 Nuffield Department of Clinical Neurosciences, Division of Clinical Neurology, University of Oxford, Oxford OX3 9DU, UK  
 16 Oxford Parkinson's Disease Centre, University of Oxford, Oxford OX1 3QU, UK  
 17 School of Neuroscience and Psychology, University of Glasgow, Glasgow G51 4TF, UK  
 18 Reta Lila Weston Institute, UCL Queen Square Institute of Neurology, London WC1N 1PJ, UK  
 19 National Institute for Health Research (NIHR) University College London Hospitals Biomedical Research Centre, London W1T 7DN, UK  
 20 Institute for Advanced Study, The Hong Kong University of Science and Technology, Hong Kong SAR, China

Correspondence to: Professor Huw R. Morris  
 Department of Clinical and Movement Neurosciences  
 UCL Queen Square Institute of Neurology, Royal Free Hospital  
 Rowland Hill Street, London NW3 2PF, UK  
 E-mail: h.morris@ucl.ac.uk

Correspondence may also be addressed to: Dr Raquel Real  
 Department of Clinical and Movement Neurosciences  
 UCL Queen Square Institute of Neurology, Queen Square House  
 Queen Square, London WC1N 3BG, UK  
 E-mail: r.real@ucl.ac.uk

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## Introduction

Parkinson's disease (PD) is the second most common neurodegenerative disease, with an estimated worldwide prevalence of 100–200 cases per 100 000 individuals.<sup>1</sup> Although PD is mainly viewed as a motor disorder, the development of dementia in PD is an important determinant of morbidity, mortality and need for social support.<sup>2</sup> The clinico-pathological phenotype of Parkinson's disease dementia (PDD) can be indistinguishable from dementia with Lewy bodies, although in PDD motor symptoms must by definition precede the development of dementia by at least 1 year.<sup>3</sup> Neuropsychiatric manifestations of PDD include cognitive fluctuation with visual misperception, hallucinations and delusions together with deficits in attention, executive and visuo-spatial function. Cholinergic denervation seems to be important in PDD and cholinesterase inhibitors can improve PDD symptoms,<sup>4</sup> but there is no treatment for the underlying disease pathology. Identifying the causal mechanisms will be an important step in defining new treatments.

Age is the single most important risk factor for PDD. It is estimated that by the age of 90, 80–90% of individuals with PD will have developed dementia.<sup>4</sup> Other clinical predictors of progression to dementia include disease severity and longer disease duration.<sup>5–7</sup> However, the rates of progression to PDD vary substantially among individuals, which has important implications for prognosis and quality of life. Several genetic factors have been reported to increase the risk or rate of progression to PDD. The most widely reported genetic risk

factor associated with increased risk of conversion to PDD is the APOE  $\epsilon$ 4 allele.<sup>8–11</sup> A meta-analysis of 17 studies found a significantly higher risk of developing dementia in PD carriers of the  $\epsilon$ 4 allele.<sup>11</sup> Single rare variants in the *GBA* gene increase the risk of developing PDD, and the risk may relate to the pathogenicity of the variant.<sup>12–14</sup> Several studies have also reported that the *MAPT* H1 haplotype is associated with dementia,<sup>9,15–17</sup> although this has not been universally replicated.<sup>10</sup> More recently, the *RIMS2* locus has been described in association with progression to PDD, as well as suggestive association signals at the *TMEM108* and *WWOX* loci.<sup>18</sup> Genome-wide association studies in neurodegenerative disease have largely defined case-control risk factors for disease susceptibility, but the increasing availability of high-quality longitudinal clinical datasets enables a systematic search for disease modifying factors. Here, we use a genome-wide survival meta-analysis approach to identify new genetic factors that contribute to the progression to PDD.

## Materials and methods

### Patient cohorts

We have studied four independent longitudinal PD cohorts: Tracking Parkinson's Disease (TPD, [www.parkinsons.org.uk/](http://www.parkinsons.org.uk/)),<sup>19</sup> Oxford Parkinson's Disease Centre Discovery Cohort (OPDC, [www.dpag.ox.ac.uk/opdc/](http://www.dpag.ox.ac.uk/opdc/)),<sup>20</sup> Accelerating Medicines Partnership: Parkinson's Disease (AMP-PD v2.5, [www.amp-pd.org/](http://www.amp-pd.org/)), which consists of harmonized data from multiple cohorts,<sup>21</sup> and Drug Interaction With Genes

in Parkinson's Disease (DIGPD, [clinicaltrials.gov/ct2/show/NCT01564992](https://clinicaltrials.gov/ct2/show/NCT01564992)), comprising a total of 3923 participants after clinical and genetic data cleaning (Supplementary Fig. 1 and Table 1). Each subject provided written informed consent for participation according to the Declaration of Helsinki and all cohort studies were approved by the relevant ethics committee. Methods for clinical data collection, including setting, inclusion criteria and periods of recruitment, are available from the websites of the corresponding cohorts. All participants were diagnosed with PD according to the Queen Square Brain Bank criteria.<sup>22</sup> Participants were excluded from the analysis if an alternative diagnosis was made during the follow-up period (including a diagnosis of dementia with Lewy bodies) and/or the probability of a PD diagnosis as assessed by a clinician at the last available visit was <90%. In AMP-PD, only individuals in the PD study arm were included to avoid selection bias of monogenic cases. Criteria for PDD were based on the Movement Disorders Society Taskforce Parkinson's disease dementia diagnostic criteria.<sup>3,18</sup> Specifically, participants were classified as having PDD if they had adjusted Montreal Cognitive Assessment (MoCA) scores <21/30, at least two cognitive domains impaired in the MoCA scale (attention/serial sevens  $\leq 2/3$ ; language/verbal fluency 0/1; memory/delayed recall  $\leq 4/5$ ; visuospatial/executive  $\leq 4/5$ ), a cognitive deficit severe enough to affect activities of daily living (Movement Disorders Society-Unified Parkinson's disease Rating Scale part I 1.1 score  $\geq 2$ ), and absence of severe depression (Movement Disorders Society-Unified Parkinson's Disease Rating Scale part I 1.3 score <4), except participants from the DIGPD cohort, for whom only Mini-Mental State Examination (MMSE) scores were available together with a clinician assigned diagnosis of dementia. Participants were excluded from the study (left censored) if they met criteria for PDD at study baseline (Supplementary Table 1). Time-to-event was calculated as the number of years from disease diagnosis until the midpoint between the date of the first visit where criteria for PDD were met or of study withdrawal due to dementia and the date of the previous available visit. The time interval between the last normal assessment and withdrawal due to dementia was on average  $1.66 \pm 0.77$  years for TPD and  $2.57 \pm 1.18$  years for OPDC. Individuals with missing data regarding time-to-event or event classification were also excluded from the study. Time intervals between visits varied across studies, with assessments being carried out every 18 months in the TPD and OPDC cohorts and every 12 months in the DIGPD and AMP-PD cohorts. Comparisons across cohorts were performed in R (R Project for Statistical Computing, RRID:SCR\_001905; v.4.1.3; <https://www.R-project.org/>) using Pearson's Chi-squared test (rstatix package,

v.0.7.0; RRID:SCR\_021240; <https://CRAN.R-project.org/package=rstatix>) for categorical variables, and Kruskal–Wallis test with Dunn's test for post hoc multiple pairwise comparisons for continuous variables, with P-values adjusted by the Bonferroni method (stats package, v.4.1.3; <https://stat.ethz.ch/R-manual/R-devel/library/stats/html/00Index.html>). Significance was set at  $\alpha = 0.05$ .

## Data quality control

Whole-genome sequence data were available from participants in AMP-PD cohorts. The remainder of samples were genotyped with the Illumina HumanCoreExome array (TPD), Illumina HumanCoreExome-12 v.1.1 or Illumina Infinium HumanCoreExome-24 v.1.1 arrays (OPDC) and the Illumina Infinium Multi-Ethnic Global (MEGA) array (DIGPD). Sample quality control (QC) included the exclusion of samples with call rates <98%, samples with excess heterozygosity [defined as samples deviating more than two standard deviations ( $>2SD$ ) from the mean heterozygosity rate], samples with a mismatch between clinical sex and genetically determined sex from chromosome X heterogeneity, and samples from related individuals ( $\pi\text{-hat} > 0.125$ ). Variants with missingness rate  $> 5\%$ , minor allele frequency  $< 0.01$  and Hardy–Weinberg equilibrium  $P < 1 \times 10^{-05}$  were excluded. To identify the ancestry, variants in linkage disequilibrium were removed and samples clustered against the HapMap3 reference panel, using principal component analysis. Individuals who deviated  $> 6SD$  from the mean of the first 10 principal components of the HapMap3 CEU + TSI population were excluded from the analysis (Supplementary Fig. 12A). To avoid inclusion of individuals related to each other across the different cohorts, we merged the genetic data from all cohorts and performed a second relatedness check ( $\pi\text{-hat} > 0.125$ ). For each pair of related individuals, the one with the highest missingness rate was excluded from the respective cohort. After extraction of European-ancestry samples and non-related individuals from each cohort, principal components were re-calculated to use as covariates. The genotyping array data were then imputed against the Haplotype Reference Consortium reference panel (v.r1.1 2016; <http://www.haplotype-reference-consortium.org/>) in the Michigan Imputation Server (RRID:SCR\_017579; <https://imputationserver.sph.umich.edu/>)<sup>23</sup> using Minimac4 (v.1.0.0; <https://genome.sph.umich.edu/wiki/Minimac4> v.1.0.0). Imputed variants were excluded if the imputation info  $R^2$  score was  $\leq 0.3$ . Following imputation, variants with missingness  $> 5\%$  and minor allele frequencies  $< 1\%$  were also excluded. Data cleaning was performed using PLINK v.1.9 (RRID:SCR\_001757; <https://www.cog-genomics.org/plink/1.9/>).<sup>24</sup>

**Table 1 Demographic characteristics per cohort**

Cohorts	TPD	OPDC	DIGPD	AMP-PD <sup>a</sup>
n (% female)	1424 (35.4)	772 (35.0)	370 (39.7)	1357 (38.2)
Age at diagnosis, years	65.8 $\pm$ 9.1	65.9 $\pm$ 9.5	59.6 $\pm$ 9.9	60.0 $\pm$ 9.7
Age at baseline, years	67.2 $\pm$ 9.1	67.1 $\pm$ 9.4	62.2 $\pm$ 9.9	63.7 $\pm$ 9.1
MoCA at baseline	25.5 $\pm$ 3.1	25.1 $\pm$ 3.2	n/a	26.5 $\pm$ 2.8
MMSE at baseline	n/a	n/a	28.3 $\pm$ 1.73	n/a
Years from diagnosis to baseline	1.32 $\pm$ 0.90	1.21 $\pm$ 0.93	2.55 $\pm$ 1.52	3.70 $\pm$ 4.68
Education $\leq 12$ years (%)	31.5	38.3	37.8	12.3
Event rate (%)	7.2	12.4	5.13	3.54
Years from PD diagnosis to dementia	3.80 $\pm$ 2.00	4.38 $\pm$ 2.25	6.24 $\pm$ 2.49	4.91 $\pm$ 2.79
Months in study (median)	44.1	53.8	60.2	30

Data presented as mean  $\pm$  standard deviation, except where indicated.

<sup>a</sup>Investigation for New Discovery of Biomarkers (BioFIND) study (n = 88); Parkinson's Disease Biomarker Program (PDBP) study (n = 670); Parkinson's Progression Markers Initiative (PPMI) study (n = 368); SURE-PD3 study (n = 231).

## Time-to-event genome-wide survival study and meta-analysis

A time-to-event genome-wide survival study (GWSS) was performed in R (v.4.1.2) in each cohort, using the Cox proportional hazards (CPH) function in the survival package (v.3.2.13; RRID:SCR\_021137; <https://CRAN.R-project.org/package=survival>), in which time to PDD was regressed against each single nucleotide polymorphism (SNP), with age at diagnosis, sex and first five principal components as covariates. AMP-PD summary statistics were converted from hg38 to hg19 using the binary liftOver tool (RRID:SCR\_018160; <https://genome.sph.umich.edu/wiki/LiftOver>). The summary results from each cohort were then meta-analysed using METAL software in a random-effects model, using genomic control correction (version released on the 25 March 2011; RRID:SCR\_002013; <http://csg.sph.umich.edu/abecasis/Metal/>).<sup>25</sup> The genomic inflation factor ( $\lambda_{gc}$ ) for each cohort varied between 0.863 and 0.9773. After the meta-analysis, the  $\lambda_{gc}$  was 1.035 (Supplementary Fig. 12B). On completion of the meta-analysis, variants that were not present in all samples were excluded, as well as variants with minor allele frequency variability >15% across studies. Variants were also excluded if the *P*-value for the Cochran's *Q*-test for heterogeneity was <0.05 and the  $I^2$  statistic was  $\leq 80\%$ . Forest plots of variants of interest were prepared using the R package forestplot (v.2.0.1; <https://CRAN.R-project.org/package=forestplot>). Results of the meta-analysis were annotated using FUMA (Functional Mapping and Annotation of Genome-Wide Association Studies, RRID:SCR\_017521; v.1.3.8; <https://fuma.ctglab.nl/>).<sup>26</sup> Regional association plots were generated in LocusZoom (RRID:SCR\_021374; <http://locuszoom.org/>).<sup>27</sup> LDproxy (<https://ldlink.nci.nih.gov/?tab=ldproxy>)<sup>28</sup> was used to identify variants in high linkage disequilibrium with variants of interest.

## Tissue and cell-type specificity measures

Specificity represents the proportion of a gene's total expression attributable to one cell type/tissue. To determine specificity of a gene to a tissue or cell type, specificity values from three independent gene expression datasets were generated. Briefly, these datasets included (i) bulk-tissue RNA-sequencing of 53 human tissues from the Genotype-Tissue Expression consortium (GTEx, v.8; RRID:SCR\_013042)<sup>29</sup>; (ii) human single-nucleus RNA-sequencing of the middle temporal gyrus from the Allen Institute for Brain Science (AIBS, Allen Cell Types Database—Human MTG Smart-Seq 2018 dataset, available from [celltypes.brain-map.org/maseq](http://celltypes.brain-map.org/maseq); RRID:SCR\_014806)<sup>30</sup>; and (iii) human single-nucleus RNA-sequencing of the substantia nigra.<sup>31</sup> Generation of specificity values for GTEx and AIBS were previously described in Chia et al.<sup>32</sup> Briefly, specificity values for GTEx were generated using code modified from a previous publication ([https://github.com/jbryois/scRNA\\_disease](https://github.com/jbryois/scRNA_disease)),<sup>33</sup> to reduce redundancy among brain regions and to include protein- and non-protein-coding genes. Specificity values for the AIBS-derived dataset were generated using gene-level exonic reads and the 'generate.celltype.data' function of the EWCE R package (v.1.2.0).<sup>34</sup> Likewise, specificity values from Agarwal et al.<sup>31</sup> were generated using EWCE. Specificity values for all three datasets and the code used to generate these values are openly available at <https://github.com/RHReynolds/MarkerGenes>.<sup>35</sup>

## Conditional analysis

To understand whether one or more genome-wide significant variants at the same locus were contributing to the signal, we performed conditional analysis on single SNPs using a conditional

and joint association analysis approach. We used the GWSS meta-analysis summary statistics and the entire AMP-PD cohort ( $n = 10\,418$ ) as the reference sample for linkage disequilibrium estimation. The reference sample was subjected to the same QC steps as described before. We then used CGTA-COJO software (v.1.93.0 beta for Linux; <https://yanglab.westlake.edu.cn/software/gcta/#Overview>)<sup>36</sup> to perform association analysis conditional on SNPs of interest.

## Colocalization analysis

To investigate whether there is an overlap between PDD loci and expression quantitative trait loci (eQTLs), we used the coloc R package (v.5.1.0; <https://cran.r-project.org/web/packages/coloc/index.html>).<sup>37</sup> We also used the R package colocHLR (v.0.99.0)<sup>38</sup> to help prepare datasets for use with coloc. We took a Bayesian inference approach to test the  $H_4$  null hypothesis that there is a shared causal variant associated with both progression to PDD and gene expression regulation. The Bayesian inference approach additionally computes the posterior probability that there is no association with either trait ( $H_0$ ), there is association with the PDD trait but not the eQTL trait ( $H_1$ ), there is association with the eQTL trait but not the PDD trait ( $H_2$ ) and that there is association with both traits, but the causal variants are independent ( $H_3$ ). We extracted all the genes within 1 Mb of each significant locus in the PDD GWSS. Coloc was run using default  $p_1 = 10^{-4}$ ,  $p_2 = 10^{-4}$  and  $p_{12} = 10^{-5}$  priors ( $p_1$  and  $p_2$  are the prior probability that any random SNP in the region is associated with trait 1 and 2, respectively, while  $p_{12}$  is the prior probability that any random SNP in the region is associated with both traits). A  $PPH_4 > 0.9$  was considered evidence for the presence of a shared variant between traits, i.e. signal colocalization. Coloc calculates Bayes factors under the assumption that a single causal variant exists within a particular locus. This assumption may be relaxed by successively conditioning on the most significant variants for each trait, and testing for colocalization between each pair of conditioned signals.<sup>39</sup> We therefore performed conditional analysis beforehand to confirm that there were no additional independent signals, thus meeting the assumption of a single causal variant at each locus. Cis-eQTL data were obtained from (i) eQTLGen, comprising bulk blood-derived gene expression from 31 684 individuals (<https://www.eqtlgen.org/cis-eqtl.html>, accessed on the 7 June 2021); and (ii) PsychENCODE, comprising gene expression from bulk RNA-sequencing from the prefrontal cortex of 1387 individuals (<http://resource.psychencode.org/>, accessed on the 7 June 2021).<sup>40,41</sup> Next, to understand if *LRP1B* or *BBS9* loci regulate alternative splicing, we used a similar approach using frontal cortex and substantia nigra splicing QTLs (sQTLs) data from the GTEx v.8 database containing all variant-gene associations from 183 and 100 individuals, respectively, based on LeafCutter (v.0.2.9; RRID:SCR\_017639; <https://davidaknowles.github.io/leafcutter/>)<sup>42</sup> intron excision phenotypes. For *LRP1B*, we tested the alternative splicing from eight different introns. In addition, false discovery rate-filtered transcript-per-million transcript expression QTLs (tQTLs) (false discovery rate <0.001) were obtained from PsychENCODE and used to generate regional association plots overlapping with *LRP1B* signals. A full colocalization analysis for tQTLs was not possible due to the unavailability of unfiltered tQTL summary statistics from PsychENCODE.

## Signal interaction between APOE and LRP1B

Given the affinity of *LRP1B* for ApoE-carrying lipoproteins, we conducted a survival analysis based on *APOE*  $\epsilon 4$  allele and *LRP1B*

rs80306347 carrier status to understand whether the effect of LRP1B rs80306347 signal was dependent on APOE. APOE genotypes were inferred from the imputed genotypes of rs7412 and rs429358 variants. Participants of the combined cohorts ( $n = 3923$ ) were grouped according to the presence of the two markers either simultaneously or exclusively, and a CPH model adjusted for age at diagnosis, gender, the first five principal components and a cohort term was performed. We also conditioned the analysis on APOE  $\epsilon 4$  carrier status by performing a survival analysis of LRP1B rs80306347 on APOE  $\epsilon 4$  carriers and non-carriers separately. We have in addition performed the analysis including an interaction term between LRP1B rs80306347 and APOE  $\epsilon 4$  carrier status.

### Candidate loci analysis

We additionally performed a candidate loci analysis of specific loci or variants of interest in the combined cohorts to increase power ( $n = 3923$ ), using CPH models adjusted for age at diagnosis, sex, the first five principal components and a cohort term. The regions of interest consisted of genetic variants or loci previously identified in association with cognitive impairment in PD and/or dementia with Lewy bodies: APOE  $\epsilon 4$  allele (rs429358),<sup>8–10</sup> GBA variants E365K (or E326K, rs2230288), T408M (or T369M, rs75548401) and N409S (or N370S, rs76763715),<sup>12,13,43</sup> SNCA (rs356219, rs7680557, rs7681440, rs11931074, rs7684318),<sup>32,44–46</sup> MAPT H1 haplotype (rs1800547),<sup>9,15–17</sup> RIMS2 (rs182987047), TMEM108 (rs138073281) and WWOX (rs8050111).<sup>18</sup> In addition, participants from DIGPD and a subset of individuals from the TPD study were Sanger sequenced for GBA ( $n = 1793$ ). We performed a survival analysis as before based on GBA carrier status, for which we defined GBA mutation carriers as individuals with at least one Gaucher disease-causing mutation or PD-risk factor (Supplementary Table 2).

### Genetic risk scores

To understand whether there is overlap in the risk of development of PDD and the risk of PD or Alzheimer's disease, we performed a genetic risk score (GRS) analysis using PLINK v.1.9 software.<sup>24</sup> Scores were calculated using the summary statistics from the largest PD genome-wide association study (GWAS) to date and the 2019 genome-wide association meta-analysis of Alzheimer's disease, respectively.<sup>47,48</sup> Only the independent genome-wide significant risk signals were used in the analysis. Scores were then z-transformed and added as a covariate in a logistic regression model, together with age at diagnosis, sex and the first five principal components. Each cohort was analysed independently, and results were meta-analysed using the meta R package (v.5.1-1; RRID: SCR\_019055; <https://CRAN.R-project.org/package=meta>).<sup>49</sup> We conducted the Alzheimer's disease-GRS analysis also without the APOE signal to investigate if the effect of Alzheimer's disease-GRS in the risk of developing PDD was mediated by factors independent of APOE. For the survival analysis based on Alzheimer's disease-GRS, individuals were stratified into low-, middle- and high-risk tertiles of raw Alzheimer's disease-GRS. We used CPH models adjusted for age at diagnosis, sex and the first five principal components in each cohort; results were then meta-analysed with the R package meta.

### Association of clinical phenotype and APOE genotype with CSF biomarkers

A subset of AMP-PD participants [from the Investigation for New Discovery of Biomarkers (BioFIND) and Parkinson's Progression

Markers Initiative (PPMI) studies] included in the analysis have longitudinal CSF Alzheimer's disease biomarker data available ( $n = 434$ ). We investigated the association of phenotype (PDD versus PD) and APOE  $\epsilon 4$  carrier status with average levels of amyloid beta (A $\beta$ ) 42, total tau and tau phosphorylated at threonine 181 (p-Tau181) using unpaired two-sample Wilcoxon rank-sum tests (R stats package, v.4.1.2) at baseline, 12, 24 and 36 months of follow-up. Significance was set at  $\alpha = 0.05$ .

### Statistical power modelling

The R package survSNP (<https://cran.r-project.org/web/packages/survSNP/index.html>; v.0.25)<sup>50</sup> was used to model statistical power across a range of minor allele frequencies and effect sizes. The time-to-event was fixed at 4.5 years. Modelling accounted for the event rates observed in the different cohorts.

### Data availability

Meta-analysis summary statistics are available for download from <https://pdgenetics.org/resources>. TPD data are available on access request from <https://www.trackingparkinsons.org.uk/about-1/data/>. BioFIND, PPMI, Parkinson's Disease Biomarker Program (PDBP) and SURE-PD3 cohorts were accessed from AMP-PD and data are available on registration at <https://www.amp-pd.org/>. OPDC data are available on request from the Dementias Platform UK (<https://portal.dementiasplatform.uk/Apply>). DIGPD data are available on request to the principal investigator (J.C. Corvol, Assistance Publique Hôpitaux de Paris). HapMap phase 3 data (HapMap3) are available for download at <ftp://ftp.ncbi.nlm.nih.gov/hapmap/>. The Ashkenazi Jewish population panel is accessible at <https://www.ncbi.nlm.nih.gov/gds> (accession ID: GSE23636). Cis-QTL data were obtained from eQTLGen (<https://www.eqtlgen.org/cis-eqtls.html>) and PsychENCODE (<http://resource.psychencode.org>). False discovery rate-filtered tQTL data were obtained from PsychENCODE (<http://resource.psychencode.org/>). Cortical sQTL data were accessed from the GTEx v.8 database (<https://gtexportal.org/home/>). GTEx bulk-tissue RNA-seq data are available at <https://www.gtexportal.org/home/datasets>. AIBS human single-nucleus RNA-seq data are available at <https://portal.brain-map.org/atlas-and-data/maseq>. Human single-nucleus RNA-seq of the substantia nigra data can be accessed from <https://www.ncbi.nlm.nih.gov/geo/> (accession ID: GSE140231). Summary statistics from the PD GWAS (Nalls et al.<sup>47</sup>) used to perform the GRS analysis are available from <https://pdgenetics.org/resources>. Code used in the analysis is available from [https://github.com/huw-morris-lab/PDD\\_GWSS](https://github.com/huw-morris-lab/PDD_GWSS) (<https://doi.org/10.5281/zenodo.6535455>).

## Results

### Cohort characterization

Following data cleaning (Supplementary Fig. 1), a total of 3923 individuals diagnosed with PD were available for analysis, with an overall mean follow-up time of  $43.4 \pm 27.7$  months. Demographic characteristics of each patient cohort are shown in Table 1. Participants in DIGPD and AMP-PD cohorts were significantly younger at PD diagnosis (Kruskal–Wallis chi-squared value = 348, d.f. = 3,  $P < 2 \times 10^{-16}$ , post hoc Dunn's multiple comparison test in Supplementary Table 3) and at study baseline (Kruskal–Wallis chi-squared value = 160, d.f. = 3,  $P < 2 \times 10^{-16}$ , post hoc Dunn's multiple comparison test in Supplementary Table 3), which is probably reflected in the significantly reduced event rates in these two

cohorts (Table 1). Adjusted MoCA or MMSE scores over time in cases of PD who did not develop dementia during the study follow-up remained constant over time, while they were consistently lower and showed greater decline in individuals who went on to develop PDD during the study follow-up (Supplementary Fig. 2).

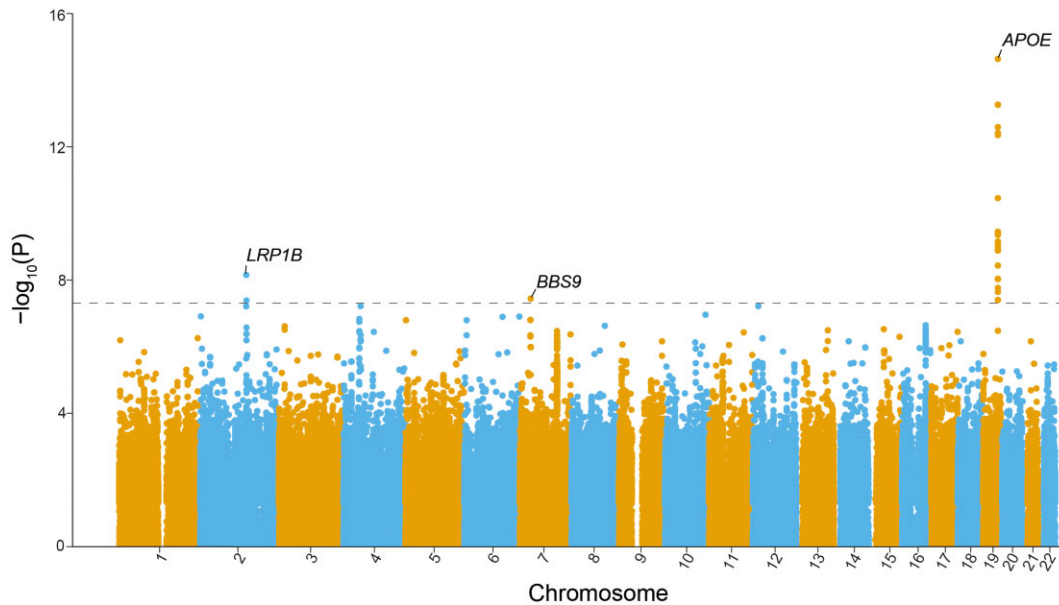
### Identification of genetic determinants of Parkinson's disease dementia

In our genome-wide survival meta-analysis assessing the role of 6 107 418 SNPs in the development of PDD, we identified three genome-wide significant genetic loci (Fig. 1 and Table 2; regional association plots in Supplementary Fig. 3). The most significant SNP was the  $\epsilon$ 4 allele-tagging SNP rs429358 in APOE [hazard ratio (HR) = 2.41, 95% confidence interval (CI) = 1.94–3.00,  $P = 2.32 \times 10^{-15}$ ]. APOE is the most important genetic risk factor for the development of Alzheimer's disease and has also been shown in multiple studies to contribute to cognitive decline and dementia in PD.<sup>8–10,51</sup> Conditional analysis on the lead SNP at the APOE locus did not reveal any other independent SNPs contributing to the signal at this location (Supplementary Fig. 4A and B).

The second genome-wide significant genetic locus was on chromosome 2. The lead SNP at this locus was rs80306347 (HR = 3.23, 95% CI = 2.17–4.81,  $P = 7.07 \times 10^{-09}$ ). This is an intronic variant located in intron 5 of the LRP1B gene (ENSG00000168702). This

gene encodes the low-density lipoprotein (LDL) receptor-related protein 1B, a member of the LDL receptor superfamily. LRP1B is a receptor for ApoE-carrying lipoproteins and is highly expressed in the adult human brain (Supplementary Fig. 5A and C).<sup>52</sup> In addition, LRP1B was found to be significantly upregulated in excitatory neurons of the anterior cingulate cortex of PDD compared to PD and control brain samples (Supplementary Fig. 6).<sup>53</sup> Similar to other LDL receptors, it is involved in the intracellular processing of the amyloid precursor protein (APP).<sup>54</sup> Therefore, LRP1B constitutes a promising candidate for regulating the development of dementia in PD. Conditioning on the rs80306347 variant abolished genome-wide significance at the LRP1B locus, confirming that a single independent SNP is responsible for the signal at this location (Supplementary Fig. 4C and D).

rs78294974 is an intronic variant in the BBS9 gene (ENSG00000122507) in chromosome 7 and was associated with progression to dementia with genome-wide significance (HR = 3.90, 95% CI = 2.40–6.32,  $P = 3.59 \times 10^{-08}$ ). This gene is ubiquitously expressed (Supplementary Fig. 5B and D) and encodes the Parathyroid Hormone-Responsive B1 (PTH1B) protein. This protein is part of a stable evolutionary conserved protein complex required for primary cilium biogenesis. The Bardet-Biedl syndrome complex is predominantly responsible for the vesicular trafficking of membrane proteins to the primary cilium, but there is some evidence that it might be involved in other vesicular transport pathways.<sup>55</sup> The Bardet-Biedl



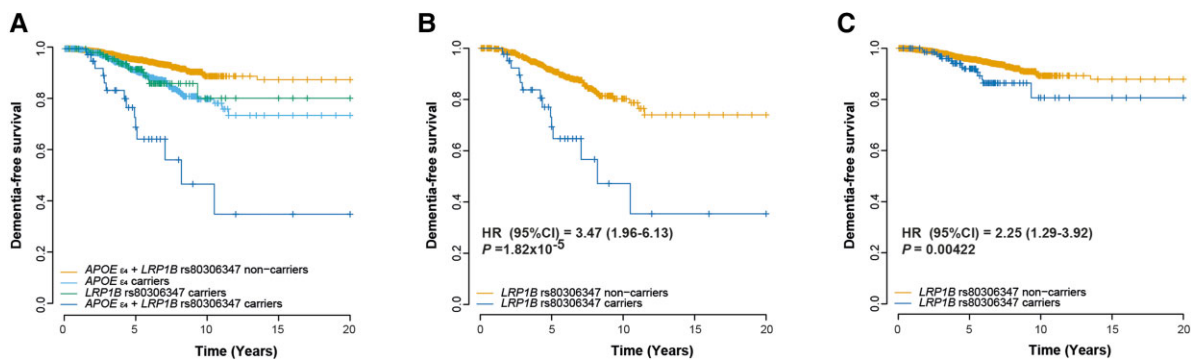
**Figure 1** Manhattan plot representing the results of the GWSS meta-analysis. The GWSS was conducted using a CPH model in each cohort separately, and results were meta-analysed (PDD:  $n = 265$ ; PD:  $n = 3658$ ). The gene closest to the top variant is indicated at each genome-wide significant locus. Genome-wide significance was set at  $5 \times 10^{-8}$  and is indicated by the dashed line.

**Table 2** Top independent SNPs from GWSS meta-analysis

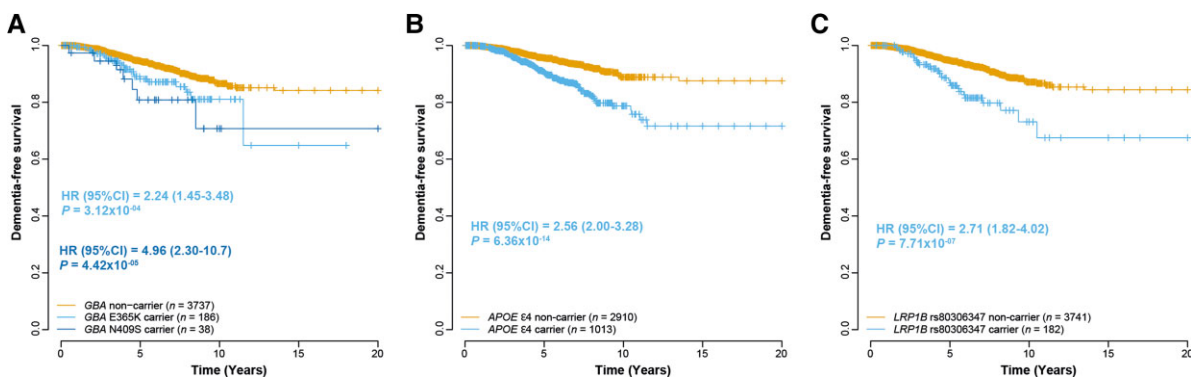
CHR	BP	SNP ID	Effect allele	Nearest gene	Effect allele frequency			HR	95% CI	P-values <sup>a</sup>
					PD	PDD	NFE			
19	45 411 941	rs429358	C	APOE	0.1322	0.2245	0.1486	2.41	1.94–3.00	$2.316 \times 10^{-15}$
2	142 000 271	rs80306347	C	LRP1B	0.0212	0.0547	0.0277	3.23	2.17–4.81	$7.067 \times 10^{-09}$
7	33 184 022	rs78294974	A	BBS9	0.0174	0.0358	0.0224	3.90	2.40–6.32	$3.589 \times 10^{-08}$

BP, = base pair position in hg19; CHR = chromosome; CI = confidence interval; HR = hazard ratio; NFE = non-Finnish European from gnomAD (<https://gnomad.broadinstitute.org/>).

<sup>a</sup>Genome-wide significance level set at  $5 \times 10^{-8}$ .



**Figure 2 Interaction between APOE and LRP1B rs80306347 signals.** (A) Kaplan–Meier curve for dementia-free survival based on APOE  $\epsilon$ 4 and LRP1B rs80306347 carrier status of PD patients. Compared to non-carriers of either allele, LRP1B rs80306347 carriers had an HR of progression to PDD of 2.33 (95% CI = 1.34–4.05;  $P = 0.00273$ ), while APOE  $\epsilon$ 4 carriers had an HR of 2.48 (95% CI = 1.91–3.21;  $P = 9.67 \times 10^{-12}$ ). Carriers of both alleles had the most significant increase in the hazards ratio of progressing to PDD (HR = 8.08; 95% CI = 4.64–14.06;  $P = 1.55 \times 10^{-13}$ ). (B) Kaplan–Meier curve for dementia-free survival based on LRP1B rs80306347 carrier status in PD APOE  $\epsilon$ 4 non-carriers. Statistical analysis was conducted using CPH models in the combined cohorts ( $n = 3923$  individuals) at the specified loci.



**Figure 3 Survival curves of candidate gene analysis.** (A) Kaplan–Meier curve for dementia-free survival based on GBA E365K (E362K) and N409S (N370S) carrier status of PD patients. (B) Kaplan–Meier curve for dementia-free survival based on APOE  $\epsilon$ 4 carrier status of PD patients. (C) Kaplan–Meier curve for dementia-free survival on the basis of LRP1B rs80306347 carrier status of PD patients. Statistical analysis was conducted per locus using CPH models in the combined cohorts ( $n = 3923$  individuals).

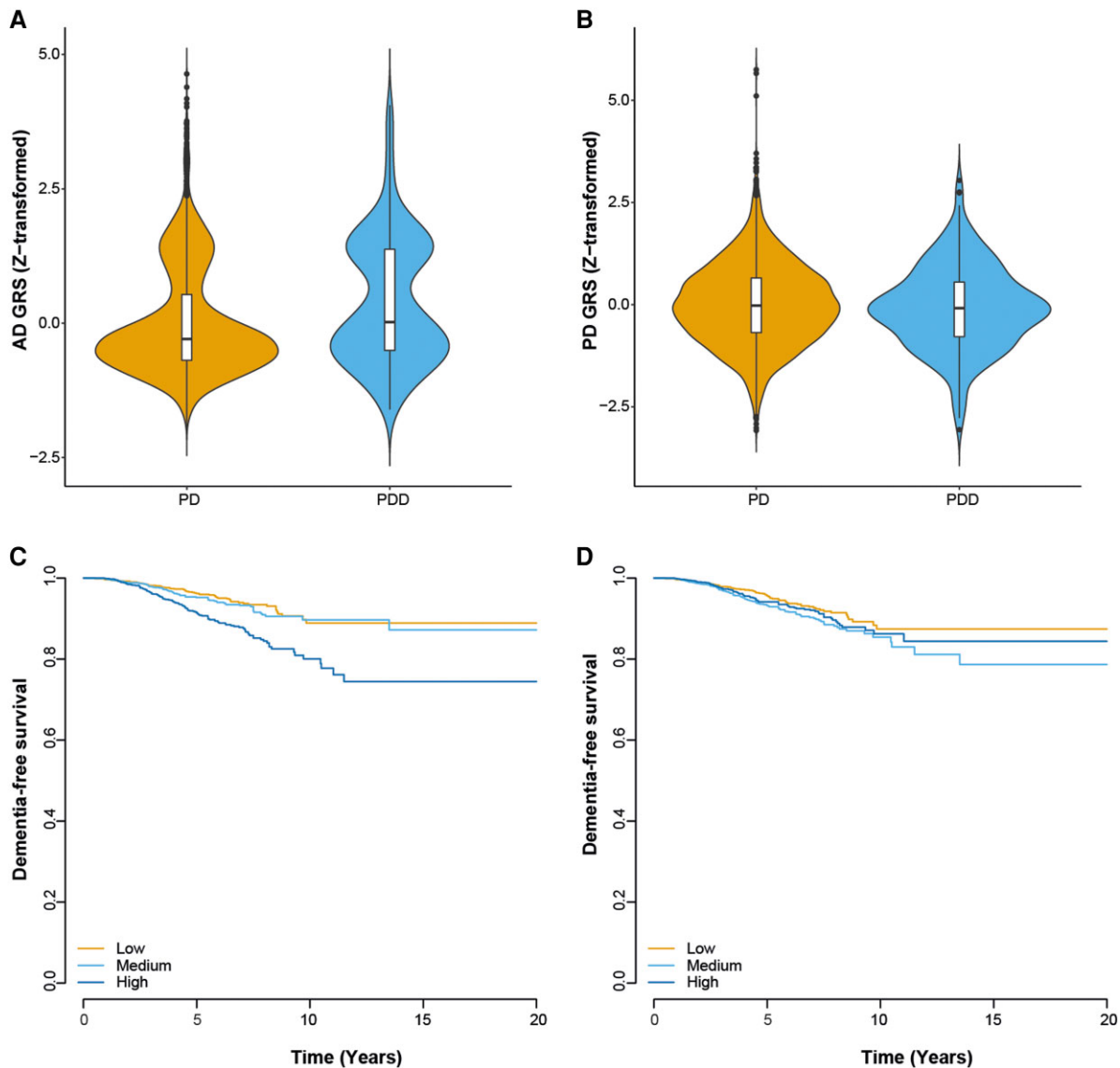
syndrome complex has been shown to bind to Rabin8, which acts as a GTP/GDP exchange factor for the small GTPase Rab8, a substrate of LRRK2. Mutations in LRRK2 that increase its kinase activity lead to enhanced phosphorylation of RAB GTPases, thus causing RAB-mediated vesicular membrane trafficking and centrosomal defects.<sup>56</sup> Because pathogenic LRRK2 mutations interfere with primary cilia formation, it has been suggested that defective ciliogenesis could contribute to the pathogenesis of LRRK2-related PD.<sup>57</sup> Interestingly, the Bardet-Biedl syndrome complex has also been shown to be present at the postsynaptic density of hippocampal neurons and to be important for dendritic spine homeostasis, which could have important implications for cognition.<sup>58</sup>

Forest plots of the GWSS meta-analysis (Supplementary Fig. 7A–C) show that the direction of the effect is consistent across cohorts in all the genome-wide significant loci, albeit with smaller contributions from AMP-PD to the LRP1B and BBS9 signals (note that due to reduced number of events in individuals in the DIGPD cohort, infinite estimates were generated by the CPH analysis of this cohort). Several factors could be contributing to these differential observations between cohorts, namely the reduced event rate in the AMP-PD cohort (3.5%) compared to TPD and OPDC (7.2 and 12.4%, respectively). This could in turn be related to the younger

age at baseline and shorter follow-up times in the AMP-PD cohorts, since increasing age is the most significant clinical risk factor for the development of dementia in PD (Table 1). To evaluate the effect of the different event rates on the power to detect a genome-wide significant effect on dementia-free survival, we modelled statistical power across a range of minor allele frequencies and effect sizes, assuming a median time to the event of 4.5 years, under an additive genetic risk model (Supplementary Fig. 8). At the current sample size, the detection of an association with genome-wide significance at 80% statistical power requires far more common alleles and/or higher effect sizes at the event rate of the AMP-PD cohort than at the event rates of the TPD and OPDC cohorts. As an example, for a SNP with effect size of the magnitude observed with LRP1B rs80306347, only SNPs with minor allele frequency of 0.15 and higher can be detected at the event rate of AMP-PD, while SNPs with a minor allele frequency of 0.05 and 0.03 can be detected at the event rates observed in TPD and OPDC, respectively, thus demonstrating how a low event rate can hinder the ability of the survival analysis to detect significant effects of variants with rarer minor allele frequencies.

Finally, we searched for potential candidate genes with a  $P$ -value near the genome-wide significance threshold that could





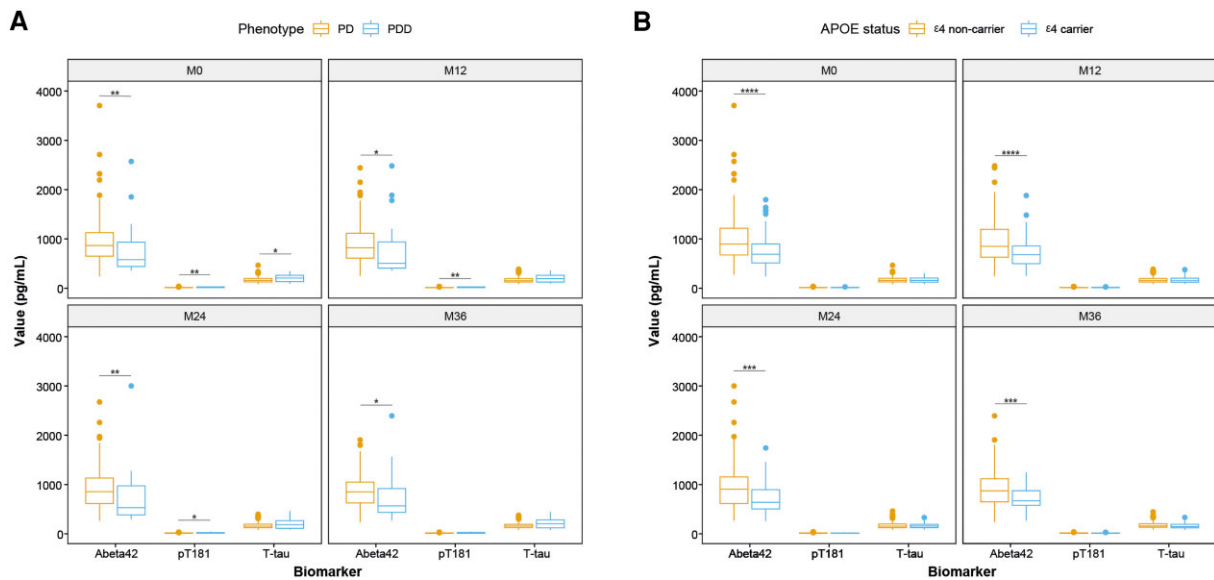
**Figure 4** Alzheimer's disease and PD-GRS. (A and B) Violin plots depicting the distribution of the meta-analysis of z-transformed Alzheimer's disease (A) and PD GRSs (B) in PD and PDD. The central line of the boxplots indicates the median, the box limits indicate the first and third quartiles, the whiskers indicate  $\pm 1.5 \times$  IQR, and the data points indicate the outliers. (C and D) Survival Kaplan–Meier curves for dementia-free survival of PD patients based on the stratification of Alzheimer's disease-GRS into low-, middle- and high-risk tertiles, either including (C) or excluding APOE (D).

be relevant for neurodegeneration. Eighty-six variants in 33 independent loci had a suggestive  $P < 1 \times 10^{-06}$  (Supplementary Table 4). The nearest genes of some of these variants are involved in pathways known to contribute to neurodegeneration, such as vesicle trafficking (*VTG1A*), ubiquitin signalling (*DDB1*), synaptic homeostasis (*PTPRD*) and endoplasmic reticulum QC and translocation (*UGGT2*, *SSR1*).<sup>59–62</sup> Interestingly, *SSR1* expression has recently been shown to be upregulated in an early PD mouse model and to be highly correlated with the loss of dopaminergic neurons.<sup>63</sup> An intronic variant in *SLC6A3*, which encodes the dopamine transporter (DAT), was also observed to be nominally associated with faster progression to dementia in PD. This receptor is specifically expressed in nigro-striatal neurons and is essential in the regulation of dopamine metabolism and neurotransmission. Given its prominent role in the metabolism of dopamine, there has been long-standing interest in this gene in relation to the

pathophysiology of PD.<sup>64,65</sup> Future studies with larger samples sizes are needed to enable the identification of associations with suggestive variants of smaller effect sizes and allele frequencies.

### Colocalization analysis

We did not identify proxy coding variants in high linkage disequilibrium with the lead variants in *LRP1B* or *BBS9*. To determine whether any of the GWSS genome-wide significant signals are involved in the regulation of gene expression, we performed colocalization analysis using eQTLs from eQTLGen<sup>41</sup> and PsychENCODE,<sup>66</sup> which represent large human blood and brain gene expression datasets, respectively. We found no colocalization between PDD GWSS loci and eQTLs from either dataset, indicating that there is currently no evidence of shared causal variants driving both gene expression and the three association signals for PDD progression



**Figure 5** CSF measurements of Alzheimer's disease biomarkers. Box plots representing the measurements (in pg/ml) of the CSF biomarkers Aβ42, p-Tau181 and total Tau in a subset of individuals from the AMP-PD cohort ( $n = 352$ ) across time (M0 = study baseline, M12 = 12 months, M24 = 24 months, M36 = 36 months). (A) CSF biomarker levels by phenotype ( $n = 28$  PDD and  $n = 324$  PD cases). (B) CSF biomarker levels by APOE  $\epsilon 4$  allele carrier status ( $n = 86$  APOE  $\epsilon 4$  allele carriers and  $n = 266$  APOE  $\epsilon 4$  allele non-carriers). Box plots display a median line, the box limits indicate the first and third quartiles, the whiskers indicate  $\pm 1.5 \times$  IQR, and the data points indicate the outliers. The Wilcoxon rank-sum test was used to compare medians across phenotypic groups. Significance threshold: \* $P < 0.05$ , \*\* $P < 0.01$ , \*\*\* $P < 0.001$ , \*\*\*\* $P < 0.0001$ .

(Supplementary Table 5). Of note, *LRP1B* is not expressed in blood, thus no *LRP1B* eQTLs (significant or non-significant) were available from eQTLGen (Supplementary Fig. 5A). Next, we explored whether non-coding GWSS significant signals could have a role in alternative splicing by performing colocalization analysis using cortical and nigral sQTLs from the Genotype-Tissue Expression (GTEx) dataset.<sup>29</sup> Again, we found no colocalization of PDD GWSS loci and sQTLs (Supplementary Table 6). We also generated regional associations plots for tQTLs from PsychENCODE and PDD GWSS signals in the region surrounding *LRP1B*, which on visual assessment did not suggest the presence of signal colocalization between *LRP1B* loci and tQTLs (Supplementary Fig. 9). Despite the power limitations of existing QTL datasets, the available data does not currently support *LRP1B* signals regulating the expression of transcript isoforms via alternative splicing.

### APOE and *LRP1B* interaction

One of the ligands of *LRP1B* at the cell surface is APOE. To investigate whether the *LRP1B* signal was independent of APOE status, we defined four groups of PD patients in the combined cohorts ( $n = 3923$ ): non-carriers of either APOE  $\epsilon 4$  or *LRP1B* rs80306347 alleles, exclusive carriers of APOE  $\epsilon 4$  allele, exclusive carriers of *LRP1B* rs80306347 allele and carriers of both alleles. We then used a CPH model in the combined cohorts to calculate the hazards of survival dementia-free in each of these groups, adjusting for sex, age at disease onset or diagnosis, the first five principal components and the cohort each individual originated from (Fig. 2A). Compared to non-carriers, participants exclusively carrying the *LRP1B* rs80306347 allele had an increased risk of progressing to PDD (HR = 2.33, 95% CI = 1.34–4.05,  $P = 0.00273$ ). In addition, we also performed survival analysis controlling for APOE status (Fig. 2B and C). An increased hazard of progression to PDD was present in *LRP1B* rs80306347 carriers in both APOE  $\epsilon 4$  allele carriers (HR = 3.47, 95% CI = 1.96–6.13,

$P = 1.82 \times 10^{-05}$ ) and APOE  $\epsilon 4$  allele non-carriers (HR = 2.25, 95% CI = 1.29–3.92,  $P = 0.00422$ ), confirming that the effect of rs80306347 is independent of the effect of APOE. Finally, individuals carrying both APOE  $\epsilon 4$  and *LRP1B* rs80306347 alleles had a much higher hazard of progression to PDD than carriers of each allele separately (HR = 8.08, 95% CI = 4.64–14.1,  $P = 1.55 \times 10^{-13}$ ), indicating an increased risk of progression to PDD in carriers of both alleles (Fig. 2A). However, the addition of an interaction term in the regression model did not confirm an interaction between the two alleles.

### Candidate gene analysis

Several other genes have been suggested to increase the risk of cognitive decline or dementia in PD. One of the most widely reported genes is *GBA*, which has also been described as a risk factor for PD and an earlier age of disease onset.<sup>47,67</sup> The non-Gaucher disease-causing *GBA* PD-risk variants E365K (rs2230288, also known as E326K) has been described in association with cognitive progression in PD.<sup>13,14</sup> We therefore performed a candidate loci survival analysis in the combined cohorts ( $n = 3923$ ) based on E365K carrier status, which confirmed a significant HR for progression to dementia (HR = 2.24, 95% CI = 1.45–3.48,  $P = 3.12 \times 10^{-04}$ ; Fig. 3A and Supplementary Table 7). Conversely, the PD-risk factor T408M (also known as T369M, rs75548401) showed a trend toward a faster rate of cognitive decline that did not reach statistical significance, in keeping with a previous study.<sup>43</sup> The mild GD-causing variant N409S (also known as N370S, rs76763715) has shown inconsistent association with cognitive decline in PD. In our candidate loci analysis, PD patients carrying this variant had a HR of 4.96 (95% CI = 2.30–10.7,  $P = 4.42 \times 10^{-05}$ ) of developing dementia. In addition, *GBA* Sanger sequencing data were available for 1793 individuals originating from the DIGPD and TPD cohorts. Mutations causing Gaucher's disease and PD-risk variants were combined for survival analysis and were present in 9.3% of the cases

(Supplementary Table 2). In this subset of patients, GBA risk variant and Gaucher's disease-mutation carriers had a HR for progression to PDD of 2.02 (95% CI = 1.21–3.32,  $P$ -value = 0.007), confirming the observation from several previous studies that GBA mutations increase the risk of dementia (Supplementary Fig. 10).<sup>12–14</sup> A similar candidate loci approach in the combined cohorts confirmed the strong association of APOE  $\epsilon$ 4 carrier status (HR = 2.56, 95% CI = 2.00–3.28,  $P = 6.36 \times 10^{-14}$ ) and LRP1B rs80306347 carrier status (HR = 2.71, 95% CI = 1.82–4.02,  $P = 7.71 \times 10^{-07}$ ) with earlier progression to PDD (Fig. 3B and C).

Multiplications of SNCA can cause autosomal dominant PD that is often associated with a high prevalence of dementia.<sup>68</sup> In addition, common variants in SNCA have been reported to increase the risk of cognitive decline or dementia in PD patients, as well as the risk of dementia with Lewy bodies, a related parkinsonism disorder in which dementia is an early feature.<sup>32,44,45</sup> We investigated five SNCA variants previously reported in the literature for association with dementia in PD or dementia with Lewy bodies, but none were shown to increase the risk of progression to PDD in our longitudinal data (Supplementary Table 7). Some of these variants have only been reported in small studies,<sup>45</sup> while rs356219 has shown inconsistent results across studies,<sup>10,69,70</sup> indicating that there is not enough evidence to support a role for common SNCA variants in the risk of cognitive decline or dementia in PD. Importantly, variants identified in dementia with Lewy bodies case-control GWAS studies<sup>44</sup> do not appear to contribute to risk of progression to dementia in PD, suggesting that the mechanisms leading to dementia with Lewy bodies and PDD do not entirely overlap.

Some studies have found that the MAPT H1 haplotype is a risk factor for cognitive decline in PD and can increase the susceptibility to dementia with Lewy bodies.<sup>9,15–17</sup> However, this finding has not been consistently replicated.<sup>10,18</sup> Similarly, we did not find any association between MAPT haplotypes and time to dementia in PD (Supplementary Table 7).

Recently, common variants in RIMS2, TMEM108 and WWOX have been suggested to associate with faster progression to PDD.<sup>18</sup> Using similar methodology and sample size, we did not replicate these findings (Supplementary Table 7), indicating that further studies are needed to confirm the role of these genes in the risk of cognitive decline in PD.

### Alzheimer's disease and Parkinson's disease genetic risk scores in Parkinson's disease dementia

Given the role of both APOE and LRP1B in APP metabolism, we next investigated the overlap between the Alzheimer's disease-risk profile with that of PD cases with and without dementia. We calculated the normalized individual-level GRS in each of the cohorts, on the basis of the summary statistics from a recent large-scale GWAS meta-analysis of Alzheimer's disease.<sup>48</sup> A generalized linear model was used to test the association of Alzheimer's disease GRSs with dementia status in each cohort, with results further meta-analysed using a random-effects model (Fig. 4A and Supplementary Fig. 11A). PDD was associated with a higher GRS for Alzheimer's disease (odds ratio = 1.48, 95% CI = 1.32–1.66,  $P = 4.47 \times 10^{-11}$ ). In contrast, the normalized GRS for PD, derived from the latest Parkinson's disease GWAS study,<sup>47</sup> was similar between PDD and non-demented PD cases (OR = 0.99, 95% CI = 0.82–1.19,  $P = 0.9078$ ; Fig. 4B and Supplementary Fig. 11C). This suggests that the genetic risk of developing PDD overlaps with the risk of developing Alzheimer's disease. Interestingly, in a subset of PD samples from the AMP-PD

cohort who have been tested for Alzheimer's disease biomarkers in CSF, PDD cases had decreased A $\beta$ <sub>42</sub> levels [median  $\pm$  interquartile range (IQR): 581  $\pm$  493 pg/ml versus 867  $\pm$  478 pg/ml,  $P = 0.001193$ , Wilcoxon rank-sum test] and increased total tau (208  $\pm$  129 pg/ml versus 158  $\pm$  70 pg/ml,  $P = 0.01617$ , Wilcoxon rank-sum test) and p-Tau181 (18.3  $\pm$  14.3 pg/ml versus 13.3  $\pm$  5.84 pg/ml,  $P = 0.002544$ , Wilcoxon rank-sum test) levels at baseline (Fig. 5A), supporting the hypothesis that APP metabolism is important for the development of PDD. In addition, APOE  $\epsilon$ 4 carriers also had significantly decreased CSF A $\beta$ <sub>42</sub> levels at baseline (median  $\pm$  IQR: 689  $\pm$  386 pg/ml versus 896  $\pm$  543 pg/ml,  $P = 1.7 \times 10^{-06}$ , Wilcoxon rank-sum test) and subsequent time points, with no change in total tau or p-Tau181 levels (Fig. 5B). This is in keeping with results from previous genome-wide association studies of Alzheimer's disease biomarkers, showing an association of APOE with abnormal amyloid status in either CSF or PET scans.<sup>71–74</sup>

APOE status is the most significant genetic determinant of the risk of developing Alzheimer's disease,<sup>48</sup> and was also confirmed to be significantly associated with the risk of progression to PDD in individuals previously diagnosed with PD. Therefore, to establish that the association between Alzheimer's disease-GRS and progression to PDD is not exclusively due to the overlap of the APOE signal between these two conditions, we adjusted the generalized linear models for APOE  $\epsilon$ 4 carrier status. When adjusting for APOE  $\epsilon$ 4 carrier status, there was no significant association between PDD and the GRS for Alzheimer's disease (OR = 1.06, 95% CI = 0.93–1.21,  $P = 0.374$ ; Supplementary Fig. 11B), indicating that APOE  $\epsilon$ 4 carrier status alone is driving the risk of progression to dementia among Alzheimer's disease GWAS top hits.

Finally, we assessed whether a higher Alzheimer's disease-GRS could be contributing to decreased dementia-free survival, i.e. faster progression to PDD. We performed survival analysis using CPH models to calculate the hazards of survival dementia-free after stratification of PD individuals into low-, middle- and high-risk on the basis of Alzheimer's disease GRSs. Individuals in the higher tertile of Alzheimer's disease-GRS had faster progression to dementia (HR = 2.38, 95% CI = 1.66–3.40,  $P = 1.98 \times 10^{-06}$ ), but as with the overall risk of PDD, faster progression to dementia was abolished after exclusion of the APOE signal (HR = 1.16, 95% CI = 0.85–1.60,  $P = 0.3438$ , Fig. 4C and D).

## Discussion

We have conducted a large GWSS of progression to dementia in PD patients. APOE has consistently been implicated as a risk factor for Alzheimer's disease, PDD and dementia with Lewy bodies.<sup>9,32,44,47,51,75</sup> Our results confirm that APOE  $\epsilon$ 4 is also a significant contributing factor in the rate of progression to PDD, while a candidate gene approach confirmed the role of non-Gaucher disease-pathogenic GBA E365K PD-risk variant and Gaucher disease-pathogenic N409S mutation in accelerating cognitive decline in PD. In addition, we identified a novel locus associated with progression to dementia. These results are in keeping with a recent study with similar sample size, study design and methodology.<sup>18</sup>

LRP1B belongs to the LDL receptor family and is highly expressed in the brain.<sup>52</sup> Several members of the LDL family have been implicated in cellular processes relevant to neurodegeneration, including tau uptake<sup>76</sup> and APP trafficking, processing and clearing.<sup>77</sup> Whether APP is processed by beta- and gamma-secretases to A $\beta$  in the amyloidogenic pathway or by alpha-secretases in the non-amyloidogenic pathway depends on its subcellular localization,

as beta-secretase is most active in the acidic pH of the endosome, which appears to be a key site for the production of A $\beta$ .<sup>78</sup> Therefore, modulation of intracellular APP trafficking by LDL receptors with opposing activities is postulated to be a crucial determinant of APP processing and subsequent neurodegeneration.<sup>79</sup> For example, binding of LRP1 and LRAD3 to APP at the cell surface leads to its enhanced endocytic trafficking and increased processing to A $\beta$ .<sup>80,81</sup> In contrast, binding of LRP1B and LRP10 to APP leads to decreased trafficking of APP to the endosome, thus resulting in reduced amyloidogenic processing of APP.<sup>54,82</sup> LRP10 mutants that disrupt the distribution of LRP10 from the trans-Golgi network to early endosomes lead to increased presence of APP in the endosomes and consequently to increased amyloidogenic processing of APP.<sup>82</sup> Interestingly, loss of function mutations in LRP10 have recently been implicated in familial PD.<sup>83</sup> Similarly, due to a slower rate of endocytosis that leads to APP accumulation at the cell surface, the binding of APP to LRP1B receptors reduces APP processing into A $\beta$  and increases secretion of soluble APP instead, suggesting that enhanced LRP1B activity could protect against the pathogenesis of Alzheimer's disease.<sup>19</sup> Interestingly, a genome-wide study comparing elderly individuals without cognitive decline and those with late onset Alzheimer's disease identified variants in LRP1B as protective against cognitive decline in old age.<sup>84</sup>

It is likely that dementia in PD can be driven by distinct mechanisms. Research in dementia with Lewy bodies, a condition closely related to PDD, has shown that GBA is more strongly associated with risk of 'pure' dementia with Lewy bodies, while APOE  $\epsilon$ 4 is more strongly associated with dementia with Lewy bodies with Alzheimer's disease co-pathology.<sup>85,86</sup> This suggests that the genetic drivers of dementia in  $\alpha$ -synucleinopathies are different in cases with and without A $\beta$  co-pathology, with GBA predisposing to pure Lewy body pathology and APOE predisposing to concomitant A $\beta$  deposition. While PD neuropathology is primarily characterized by deposition of  $\alpha$ -synuclein aggregates, dementia in PD can also be associated with A $\beta$  deposition.<sup>87–89</sup> This leads to the question of whether A $\beta$  metabolism could also play an important role in the development of PDD. In fact, increased cortical A $\beta$  deposition has been shown to be associated with a faster progression to dementia in PD,<sup>89,90</sup> and a low CSF A $\beta$ <sub>42</sub>-to-total tau ratio at baseline has been associated with cognitive decline in early PD.<sup>91</sup> Our results on Alzheimer's disease CSF biomarkers also suggest that PDD is associated with increased A $\beta$  brain pathology, and it is likely that APOE  $\epsilon$ 4 is the main driver of this association. Furthermore, APOE is known to facilitate endocytosis of A $\beta$  via LDL receptors at the cell surface,<sup>92</sup> which could offer a mechanistic link between APOE and LRP1B and a possible explanation as to why PD carriers of both APOE  $\epsilon$ 4 and LRP1B rs80306347-C alleles appear to have a faster progression to dementia. Nonetheless, there is evidence that APOE  $\epsilon$ 4 can also contribute to neurodegeneration by non-amyloidogenic mechanisms: APOE  $\epsilon$ 4 allele carriers can present with 'pure' Lewy body dementia;  $\alpha$ -synuclein pathology is increased in Lewy body dementia APOE  $\epsilon$ 4 carriers with minimal amyloid pathology, compared to age-matched non-carriers; APOE  $\epsilon$ 4 exacerbates  $\alpha$ -synuclein pathology and leads to worse neurodegeneration and cognitive performances in mice.<sup>93,94</sup>

Other genetic variants previously reported in association to dementia in PD were not confirmed. In particular, a large recent study using a similar genome-wide survival approach identified that a variant in RIMS2 was a stronger predictor of PDD than APOE and GBA.<sup>18</sup> We were unable to replicate this finding, which could be the result of small variations in the post-imputation background allele frequencies in different cohorts. Given the relatively rare minor allele

frequency of this SNP in the general population, it is possible that small changes in the allele frequency may significantly change the results of the analysis. The apparent discrepancies between studies will probably be resolved as larger longitudinal datasets become available.

Our study has some limitations. First, the analysis was conducted only in individuals of European ancestry, as data from this population was more readily available. It is therefore not possible to generalize our findings to other populations. Future studies including individuals from non-European ancestries are needed. Second, statistical power to detect a significant association is likely to be reduced by the fact that some individuals did not complete the study protocol because of early study withdrawal. It is possible that some individuals who were censored as non-dementia cases would have developed dementia if the follow-up duration had been longer. To mitigate this, individuals with normal longitudinal assessments who withdrew from the study due to the development of dementia were classified as PDD, where this information was available. This creates the potential for a skewed estimation of time to dementia in these cases. However, given the relatively short time interval between the last normal assessment and study withdrawal, the risk of disproportionate skewness is reduced. In addition, estimating time to dementia using the midpoint between the last normal assessment and withdrawal should further reduce that risk. Statistical power to detect a significant association is a function of sample size and event rates, which for dementia are likely to be influenced by mean age at baseline and duration of follow-up. Two of the cohorts (TPD and OPDC) recruited individuals of similar age to incident cohorts of Northern European ancestry, namely the cohorts included in the Parkinson's Incidence Cohorts Collaboration.<sup>95</sup> However, the remaining cohorts have a mean younger age than the observed average in incident population-based cohorts, which suggests these cohorts might not be representative of the wider PD population. Given these are non-incident cohorts, it is not possible to know when individuals who met criteria for dementia at baseline developed PDD, and so these were excluded from further analysis. It is therefore possible that individuals who develop dementia early in the disease course are not adequately represented in the dataset analysed. Despite being one of the largest genome-wide survival studies of progression to PDD, sample size and event rates are relatively small, and larger incident cohorts with longer follow-up times are needed to detect variants of small effect size. It is nevertheless reassuring that our study has identified some of the same genetic factors associated with higher risk of progression to dementia as large, incident population-based cohorts with long follow-up times such as APOE  $\epsilon$ 4 and GBA mutations, despite the potential limitations of large non-incident longitudinal cohorts.<sup>95</sup>

In conclusion, this large genome-wide study identifies several interesting and plausible new gene candidates associated with faster progression to dementia in PD, while also corroborating the importance of the previously described APOE and GBA variants for cognitive outcomes in PD. In addition, our results provide further evidence that  $\beta$ -amyloid metabolism might play an important role in the pathophysiology of PDD, which has important therapeutic implications, as strategies aimed at Alzheimer's disease could also prove effective in PD patients at risk of dementia.

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## Competing interests

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## Supplementary material

Supplementary material is available at *Brain* online.

## Appendix 1

An appendix with the DIGPD Study Group members is available online.

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