scientific reports

OPEN



Structure-activity relationships for the G-quadruplex-targeting experimental drug QN-302 and two analogues probed with comparative transcriptome profiling and molecular modeling

Ahmed Abdullah Ahmed^{1,2}, Shuang Chen¹, Maria Roman-Escorza², Richard Angell^{1,3}, Sally Oxenford^{1,4}, Matthew McConville⁵, Naomi Barton⁶, Mihiro Sunose⁵, Dan Neidle⁶, Shozeb Haider¹, Tariq Arshad⁷ & Stephen Neidle¹

The tetrasubstituted naphthalene diimide compound QN-302 binds to G-quadruplex (G4) DNA structures. It shows high potency in pancreatic ductal adenocarcinoma (PDAC) cells and inhibits the transcription of cancer-related genes in these cells and in PDAC animal models. It is currently in Phase 1a clinical evaluation as an anticancer drug. A study of structure–activity relationships of QN-302 and two related analogues (CM03 and SOP1247) is reported here. These have been probed using comparisons of transcriptional profiles from whole-genome RNA-seq analyses, together with molecular modelling and molecular dynamics simulations. Compounds CM03 and SOP1247 differ by the presence of a methoxy substituent in the latter: these two compounds have closely similar transcriptional profiles. Whereas QN-302 (with an additional benzyl-pyrrolidine group), although also showing down-regulatory effects in the same cancer-related pathways, has effects on distinct genes, for example in the hedgehog pathway. This distinctive pattern of genes affected by QN-302 is hypothesized to contribute to its superior potency compared to CM03 and SOP1247. Its enhanced ability to stabilize G4 structures has been attributed to its benzyl-pyrrolidine substituent fitting into and filling most of the space in a G4 groove compared to the hydrogen atom in CM03 or the methoxy group substituent in SOP1247.

G-quadruplexes (G4s) are higher-order structures that can be formed in DNA or RNA^{1,2} by the association of short guanine (G)-tracts such that two or more G-quartets are formed, which result in the folding of these sequences into four-stranded arrangements²⁻⁴, that are fundamentally distinct from duplex DNA or RNA. X-ray crystallographic and NMR studies have revealed the complexity of many G4 arrangements⁵. The existence of discrete G4-forming sequences in the human genome^{6,7} and their over-representation in the promoter and untranslated regions of many cancer-associated genes⁸⁻¹⁴, has led to an anticancer concept, of stabilizing G4s against unwinding with appropriate and selective small-molecule compounds, leading to inhibition of transcription, translation, or replication¹⁵⁻¹⁹, depending on the location of a G4 sequence within the targeted G4 genes. Several thousand low molecular weight compounds have been examined for G4 affinity and ability to target individual G4s, notably those in the promoters of the *MYC*, *KIT*, *KRAS* and *BCL2* genes (see for example, Refs.²⁰⁻²⁵).

Compounds based on a naphthalene diimide core²⁶⁻³² have received considerable attention in view of their demonstrated ability to exhibit anticancer activity. We have devised several generations of them, developed

¹The School of Pharmacy, University College London, London WC1N 1AX, UK. ²Now at Guy's Cancer Centre, Guy's Hospital, London SE1 9RT, UK. ³Now at Medicines Discovery Institute, Cardiff University, Cardiff CF10 3AT, UK. ⁴Now at Artios Ltd, Cambridge CB22 3FH, UK. ⁵Sygnature Discovery Ltd, BioCity, Nottingham NG1 1GR, UK. ⁶Tax Policy Associates, London EC1R 0ET, UK. ⁷Qualigen Therapeutics Inc, Carlsbad, CA 92011, USA. ^{IM}email: s.neidle@ucl.ac.uk

using structure-based design and medicinal chemistry/pharmacology to optimize hit compounds^{33–39}. Lead compounds have shown high G4 affinity and cell growth inhibition ability with GI_{50} values typically < 1 μ M in a panel of cancer cell lines. Compound CM03^{40,41} (Fig. 1a) with three side chains terminating in cationic charged end-groups, has a typical GI_{50} value of ca 10 nM in cancer cell lines and displays activity in in vivo models for pancreatic ductal adenocarcinoma (PDAC). A subsequent medicinal chemistry/pharmacology campaign to optimize the G4 affinity and biological activity of CM03 resulted in two further lead compounds, SOP1247 and QN-302 (Fig. 1b,c). These are related by changes in the substitution pattern at the 4th position on the naph-thalene diimide core, while at the same time maintaining as identical all other substituents. QN-302⁴², with a benzyl-pyrrolidine group, has outstandingly potent cell growth inhibitory activity in PDAC cells, with GI_{50} values of ca 1–2 nM and corresponding superior potency compared to CM03 and SOP1247 (with a methoxy group replacing the benzyl-pyrrolidine) in several animal models of PDAC and other human cancers. QN-302 is also a potent binder to various G4 structures⁴². It was subsequently selected by Qualigen Therapeutics Inc as a clinical candidate and has recently been given IND clearance by the Food and Drug Administration in the USA to initiate Phase 1a clinical trials. The first patient enrolled for this trial was reported in early November 2023.

We report here on a comparative analysis of the transcriptional profile of all three compounds, CM03, SOP1247 and QN-302 in the MIA-PaCa2 PDAC cell line, using a RNA-seq approach. Transcriptome (RNA-seq) data has also been included from CM03 in a MIA-PaCa2 cell line generated by us using repeated passage to be gemcitabine-resistant⁴¹ and in a 2nd PDAC cell line, PANC-1⁴⁰. Molecular modelling and molecular dynamics simulations have been used to rationalize differences in behavior between the three compounds, where a human telomeric G4-duplex structure has been taken as a paradigm for G4s embedded in duplex DNA.



Figure 1. Molecular structures of the three compounds discussed here.

(2024) 14:3447 |

Scientific Reports |

Results Cellular activity

The cellular potency of QN-302 in a small panel of PDAC cell lines is consistently ca tenfold higher than the two closely related G4 compounds SOP1247 and CM03 (Table 1). CM03 shows small but significantly superior potency compared to SOP1247 in three out of the four PDAC cell lines in the panel. This may be a consequence of the methoxy group in the latter compound, which would have a slight effect on hydrophobicity. It does not appear to affect the ability of SOP1247 compared with CM03 to stabilize a human telomeric G4 since they produce closely similar ΔT_m values. On the other hand, QN-302 has superior G4 stabilizing ability⁴³, consistent with its enhanced cell growth inhibitory and in vivo potency⁴².

Global expression changes

Figure 2 shows that QN-302 affects the down-and up-regulation of fewer genes than do the other two compounds, in accord with results from the more limited earlier studies⁴². At the 24 h time-point, the differences in numbers affected are at least threefold. Thus, QN-302 is a more selective agent than either of the other two compounds in MIA-PaCa2 cells and compared to CM03 in PANC-1 and MIA-PaCa2-gemcitabine-resistant cells.

Table 2 highlights a selection of the major downregulated pathways and genes for all three compounds in MIA-PaCa2 cells, as well as CM03 in gemcitabine-resistant MIA-PaCa2 cells and in the PANC-1 PDAC cell line. The Table shows that all the compounds induce changes in hedgehog, WNT/β-catenin, axon guidance, signal transduction and hippo pathways as well as in some transcriptional, chemokine and transporter genes. However, there are numerous differences in the responses found for individual genes. It is notable that the differences are most apparent for QN-302 compared to the other compounds as well as compared to CM03 in both PANC-1 and MIA-PaCa2 gemcitabine-resistant cell lines. Thus, in the GLI family (glioma-associated oncogenes) coding for zinc finger proteins in the hedgehog pathway, the GLI4 gene is the dominant down-regulated of the four genes GLI1-4 in all except the QN-302-treated cell line, where GLI1 is the most down-regulated gene of the four. QN-302 has lesser effects on the listed constituents of the WNT and hippo pathways compared to the other compounds. The NTN4 gene in the axon guidance pathway is highly down-regulated by QN-302, whereas it is upregulated by both CM03 and SOP1247. This gene is also involved in the WNT/ β -catenin pathway. The PRDM16 gene, which appears to act as a transcription factor and as a methyltransferase, is down-regulated by all compounds (Table 2), as is the transcriptional co-repressor gene CBFA2T3: both are notably less down-regulated by QN-302 than by the other compounds. The chemokine gene CX3CL1, on the other hand, is most strongly down-regulated by QN-302, as is the transporter gene CLIC3. The folate transporter gene SLC19A1 is consistently highly down regulated by all three compounds and in the resistant and PANC-1 cells with CM03. Components of the RAS and P38 MAP kinase signal transduction pathways are all affected, though to a lesser extent than this transporter gene, with the MAPK11 gene being consistently more affected than the other genes listed in Table 2. The S100P gene, which codes for the small calcium-binding protein S100P, is highly down-regulated by QN-302. The P value for this gene is on the edge of significance: however as previously reported⁴⁴, changes at the transcriptional and translational level found in vivo for this gene in QN-302-treated MIA-PaCa2 xenograft tissue, are highly statistically significant, so this gene is retained in the list here.

To identify the differences in gene responses that may be responsible for the increased potency of QN-302, unsupervised hierarchical clustering was performed between the RNA-seq datasets resulting from the compounds. Selected genes for the clustering were all downregulated by QN-302 in MIA-PaCa2 cells with the criteria $Log_2FC < -0.5$ and false discovery rate (FDR) < 0.05. For the other datasets, any differentially expressed genes (DEGs) that did not pass FDR < 0.05 criterion was set to 0 i.e. the clustering was performed with statistically significant DEGs.

The clustering resulted in nine clusters (Fig. 3). Cluster one is specific to genes down-regulated solely by QN-302 while other clusters contain shared down-regulated genes between all or some of the datasets e.g. clusters seven, eight and nine contain strongly downregulated genes in all datasets but cluster six is shared by all apart from the CM03-PANC1 dataset (Fig. 3).

	СМ03	SOP1247	QN-302			
GI ₅₀ 96 h (nM)						
MIA-PaCa2	9.0	13.8	1.3			
PANC-1	15.6	15.7	1.4			
CAPAN-1	26.5	38.8	5.9			
Bx-PC3	15.5	20.5	2.6			
MIA-PaCa2-GemR	14.9	N/A	3.8			
ΔT_{m} (°)						
	17.6	18.4	23.1			

Table 1. Data for cell growth inhibition and G4 melting stabilization (from a FRET study with human telomeric (htel) G4). Esds for the IC₅₀ data are ± 0.5 nM, and for the ΔT_m data are $\pm 0.5^{\circ}$. Cell growth inhibition data for compounds CM03 and QN-302 in the parental cell lines have been previously published^{40,42}, though re-measured for this study. MIA-PaCa2-GemR is a gemcitabine-resistant cell line⁴¹.



Figure 2. Volcano plots of Total numbers of differentially expressed genes induced by drug dosage in MIA-PaCa2 cells for the three G4-binding compounds (CM03, SOP1247 and QN-302) at two different time points (6 h and 24 h), from RNA-seq analyses. The differentially expressed genes were sorted into 4 subgroups based on the log₂ fold change (log₂FC) and false discovery rate (FDR): Down (Log₂ FC \leq -0.5, FDR \leq 0.1), Up (Log₂ FC \geq 0.5, FDR \leq 0.1), Down strong (Log₂ FC \leq -1.0, FDR \leq 0.05) and Up strong (Log₂ FC \geq 1.0, FDR \leq 0.05). The horizontal dotted lines indicate FDR cut-offs and the vertical dotted lines indicate Log₂ FC cut-offs for (left) down-regulated and (right) up-regulated genes. The numbers on the plot indicate the number of DEGs that meet the cut-offs.

Cluster one contains 77 QN-302-specific down-regulated genes with some also down-regulated in one or two of the other datasets. Therefore, additional filters were applied to pull out highly QN-302-specific subsets of genes by removing any gene that is downregulated ($Log_2FC < 0$) in either one of the other datasets (Table 1). Table 3 lists the most significant members of this group. All have smaller log_2FC changes than the genes highlighted in Table 2, although several such as *GFPT2*, *ASF1B* and *MSI1*, have previously been reported as having a role in PDAC (see below). The first two have elevated expression in several human tumor types (https://www.proteinatlas.org).

Molecular modelling and simulations

The modelling studies suggest that compound CM03 binds at the duplex-G4 junction of the G4 with its three pendant sidechains each residing in a groove of the G4 and the naphthalene diimide chromophore stacking onto the terminal G-quartet of the G4 (Fig. 4a), in accord with earlier molecular modelling of CM03 bound to a parallel human telomeric G4⁴⁰. Compound SOP1247 has its fourth substituent, a methoxy group, protruding into the groove (Figs. 4b, 5a). The longer benzyl-pyrrolidine substituent of QN-302, by contrast, protrudes significantly further into the groove (Fig. 5b) and its phenyl ring can effectively stack onto the adjacent guanine of the lower G-quartet (Fig. 4c). The Δ G values for the docked poses for CM03, QN302 and SOP1247 are – 171.9, – 263.7 and – 199.2 kcal/mol respectively. The molecular dynamics simulations reveal that all the complexes were stable and the side chains of the ligand are able to effectively interact with DNA grooves at the G-quadruplex-duplex junction. The average binding energies were calculated to be – 201.19, – 265.98 and – 261.35 for CM03, QN302 and SOP1247 respectively (Fig. 6).

www.nature.com/scientificreports/

Functional relevance, gene name	SOP1247 in MIA- PaCa2	CM03 in MIA- PaCa2	CM03 in MIA- PaCa2-GemR	CM03 in PANC-1	QN-302 in MIA-PaCa2	PQs			
Hedgehog pathway									
GLI1	-0.13	0.03	-0.57	-0.57	- 1.84	15			
GLI2	-0.74	-1.24	0.00	0.38	-0.15	71			
GLI3	2.63	-0.58	0.00	0.28	-0.47	13			
GLI4	- 2.67	-1.26	-2.76	-1.71	-0.90	11			
WNT pathway									
WNT5B	-0.66	-0.97	0.34	-0.01	-0.58	8			
DVL1	-1.87	-1.35	-2.68	-1.56	-0.77	30			
AXIN1	-0.92	-0.72	- 1.35	-0.74	-0.39	18			
APC2	-3.20	-1.61	-3.17	-1.62	-1.06	4			
Axon guidance									
PAK1	-1.39	-1.13	-1.74	-1.11	-0.22	14			
ROBO3	0.08	-0.53	- 1.09	-0.85	0.23	19			
PLXNA1	-1.62	-1.56	- 2.55	-1.50	-0.92	54			
NTN4	3.47	4.04	N/A	0.95	-2.46	13			
Hippo pathway									
TAZ	-0.88	-1.10	- 1.49	-0.74	-0.56	8			
TEAD2	-0.52	-0.91	-0.37	0.21	-0.61	19			
TEAD3	-0.14	-0.66	-0.33	0.07	-0.43	29			
TEAD4	-0.50	-0.31	-0.77	-0.04	-0.13	34			
SHANK2	-2.4	- 1.96	N/A	-0.44	-0.37	203			
SHANK3	-1.34	-0.85	-0.95	-1.12	-0.11	42			
Transcriptional genes					1				
PRDM16	- 3.88	- 3.39	-3.48	- 3.14	-1.91	260			
TP73	- 1.49	-1.19	-2.37	-0.99	-0.61	91			
CBFA2T3	-2.90	-2.86	-3.32	-2.24	-1.50	96			
МҮС	-0.02	0.34	0.71	0.71	-0.07	4			
Chemokines									
CX3CL1	-1.08	-1.82	N/A	0.62	-2.91	5			
CXCL1	-2.90	-1.38	-1.38	-1.69	-1.37	1			
Signal transduction pathways									
KRAS	0.22	-0.15	-0.17	0.05	-0.10	4			
MAPK11	-2.12	-2.56	- 3.03	-1.59	-1.72	18			
MAPK12	-1.11	-1.23	- 0.68	-1.44	-0.70	18			
AKT1	-1.20	-0.98	- 1.55	-1.04	-0.37	44			
ARF6	-0.99	- 0.54	- 0.99	- 0.69	-0.22	7			
IQSEC1	-0.79	- 0.53	-0.80	- 0.50	-0.20	82			
Transporters									
SLC19A1	-4.70	- 3.94	-5.25	- 2.05	-2.27	38			
SLC29A1	-0.49	-0.16	-0.60	-0.15	-0.17	25			
CLIC3	1.05	0.92	N/A	-0.29	-2.77	6			
Misc function									
HSPA1A	-0.21	-0.12	-0.46	0.01	- 1.15	3			
BCL2	-1.76	-1.24	-1.82	N/A	-0.48	21			
hTERT	-3.32	-2.47	-4.21	- 0.98	- 1.03	15			
S100P	-0.53	N/A	1.47	N/A	- 3.23	60			
RTN4R	-2.87	-2.23	-2.77	-1.85	-1.87	28			
KRT16	-4.06	-	-	0.56	-1.98	2			

Table 2. Selected down-regulated genes after 24 h drug exposure, with \log_2 FC values across all datasets, from RNA-seq analyses. PQs represent the estimated number of putative quadruplex-forming sequences, taken from^{40–42}.



Figure 3. Heat-map showing the nine clusters of differentially regulated genes in MIA-PaCa2 and PANC-1 cell lines following drug treatment. Dark-blue strips indicate the most down-regulated genes and bright red those that are the most up-regulated, in terms of log₂FC values. Genes in cluster one are solely down regulated by QN-302 treatment (see also the sub-set enclosed in the box, which are detailed in Table 3). The right-hand column indicates the status of genes in a small cohort of poorly differentiated human PDAC tumour tissues, as previously reported⁴⁴. The moderate correspondence with the QN-302 gene cluster is likely to reflect the small PDAC tumour sample size.

Gene	PQS	QN-302 in MIA-PaCa2	SOP-1247 In MIA-PaCa2	CM03 in MIA-PaCa2-GemR	CM03 in PANC-1	CM03 in MIA-PaCa2	Role in cancer
PODNL1	12	-0.67	0.99	0.14	1.04	0.22	Promotes cell proliferation and migration in glioma via regu- lating Akt/mTOR pathway
SEMA6C	11	-0.60	0.96	0.02	0.71	1.12	Suppresses proliferation of PDAC via Inhibition of AKT/ GSK3/β-catenin, cyclin D1 pathways
ASF1B	6	-0.62	0.81	0.19	0.18	1.02	Promotes malignancy and EMT process in PDAC cells. High expression in PDAC
SLC30A3	5	-0.65	2.47	0.75	2.33	1.02	Tumour suppressor in glioblastoma
LFNG	30	-0.67	1.04	0.75	0.80	0.29	Tumour suppressor in PDAC
APH1B	1	-0.68	0.94	0.23	0.10	0.26	Part of Notch signalling modulating
GFPT2	17	-0.52	1.18	0.28	1.49	1.92	Overexpressed in hypoxic PDAC
FAM105A	7	-1.18	1.46	1.15	1.41	1.14	Unknown
MSI1	29	-0.94	2.47	1.41	2.11	2.40	Notch signalling as a central regulator of PDAC





Figure 4. (**a**–**c**) Stick views of the putative ligand binding site at the junction of a duplex-G4 complex⁶¹, in each case with a bound ligand, having its carbon atoms coloured mauve. The ligand positions are based on those previously determined for QN-302⁴⁴. In Fig. 3b the methoxy substituent of SOP1247 is in an energetically favourable conformation. In Fig. 3c the phenyl ring of the benzyl-pyrrolidine substituent of QN-302 is stacked over a guanine ring of the neighbouring G-quartet.

Discussion

This study has shown that comparing detailed transcriptomic data from RNA-seq analyses has revealed significant differences in the patterns of down-regulated genes for the most potent compound QN-302 compared to the two closely related compounds CM03 and SOP1247. QN-302 is significantly more potent than the two analogues in a panel of pancreatic cancer cell lines. Dynamics simulations as well as experimental data show that QN-302 stabilizes a representative G4 structure to a greater extent than the other two. This suggests that the methoxy addition to compound CM03, resulting in compound SOP1247, has only minor effects on G4 binding, cell growth inhibition (Table 1) or the profile of downregulated genes (Table 2). In striking contrast, the benzyl-pyrrolidine substituent on QN-302 has resulted in enhanced G4 binding, probably due in large part to the phenyl group stacking onto the adjacent G-quartet, as suggested by molecular modelling⁴⁴. It also protrudes



Figure 5. (a) A view of the SOP1247 G4-duplex structure, with the G4-duplex shown in solvent-accessible surface representation and the ligand in space-filling mode, coloured according to atom type. The methoxy group is shown fitting snugly into a cavity of the groove. (b) The same view with now the QN-302 molecule bound. The benzyl-pyrrolidine substituent is seen to extend deep into the groove, contacting one side of the groove surface. The remaining space in the groove may contain a cluster of conserved structured solvent molecules, as observed experimentally in several earlier co-crystal structures of G4-naphthalenediimide complexes⁶³.

further into the G4 groove, filling much of the available space (Fig. 5b). It is plausible to speculate that this large pendant group would also enhance QN-302 affinity for some G4s that have a comparable groove in an equivalent accessible position, while also enhancing selectivity, although this remains to be demonstrated. We conclude that the benzyl-pyrrolidine group is responsible for enhanced cellular and in vivo potency, enhanced G4 binding and greater selectivity in the pattern of downregulated gene expression that it produces, at least in the MIA-PaCa2 cell line. QN-302 is more hydrophobic than SOP1247 or CM03, which may contribute to its superior cellular potency. Its half-life ($T_{1/2}$) in vivo of 37 h⁴² is comparable to that of CM03 (33 h) and SOP1247 (32 h: unpublished data). Values for bioavailability as defined by AUC_{all} (in ng.hr/mL) for CM03, QN-302⁴², and SOP1247 are 11,113, 5863 and 10,876, suggest that pharmacokinetic issues alone are not responsible for the superior activity in vivo of QN-302.

QN-302 mostly affects the same pathways as CM03 and SOP1247, but often has a greater effect on genes distinct from those sensitive to CM03 and SOP1247, in any one individual pathway (Table 2). Thus QN-302 downregulates expression of the *GL11* gene encoding the major transcription factor GL11 in the Hedgehog pathway to a greater extent than the other two compounds, which mostly affect expression of the *GL14* gene (Table 4). The GL11 protein is significantly upregulated in human PDAC⁴⁵⁻⁴⁷ and thus has been considered a potential therapeutic target⁴⁸, since its up-regulation promotes migration and metastasis⁴⁶. Genes for several other components of the Hedgehog pathway⁴⁹ are also downregulated by QN-302 (Table 2). The down regulation of other QN-302-specific genes (Table 3), although individually at modest levels, may also, we suggest, contribute cumulatively to the drug's anticancer activity in view of their role in PDAC tumorigenesis. The *ASF1B* gene, upregulated in PDAC, codes for histone chaperone 1B and is involved in PDAC progression^{50,51} by activating c-MYC⁵². The *GFPT2* gene, also up regulated in human PDAC⁵³, encodes for glutamine-fructose-6-phosphate transaminase 2, a key enzyme in the hexosamine biosynthesis pathway.

We suggest that the enhanced downregulation of several genes known to be significant in PDAC (Tables 2, 3), may be a consequence of selectivity at the G4 level. However, at present this must remain speculative in the absence of the identification of the target G4(s) within each gene, as well as detailed binding affinity data on the G4s. Many of these genes are G4-rich (Table 2). However, it is yet to be established as to which ones form stable G4s and play a significant role in transcriptional downregulation induced by QN-302. We have recently identified a plausible G4 sequence in the promoter of the *S100P* gene, 48 nucleotides upstream from the transcription start site⁴⁴, which forms a stable G4 structure under physiological K⁺ conditions, and which is further stabilized by QN-302. *S100P* has frequently been identified as an upregulated gene in PDAC^{48,53-59} and both the gene and the S100P protein are plausible therapeutic targets in PDAC, with cancer cell apoptosis and anti-tumor activity being consequences of targeting^{57,58}.

The present study is unable to fully answer the question of which genes are responsible for the high potency of QN-302. We suggest that at least some of the genes highlighted here (Tables 2, 3, Cluster1) are centrally involved, not least those that are selective for the drug, such as *GLI1*, *S100P*, *CLIC3* and *NTN4*. Previous studies have demonstrated that S100P^{57,60} is a viable target in human cancers including PDAC, probably by inducing p53-related apoptosis⁵⁸. The interaction of the GLI1 protein with selective quinoline-based small molecules⁴⁷ has been shown to down-regulate the Hedgehog signaling pathway by inhibiting GLI1-DNA binding and hence the transcription of GLI1 target proteins. This resulted in dose-dependent apoptosis in cancer cells, although the details of the mechanism involved have yet to be disclosed. This study has also shown that a decrease of *GLI1* expression in a dose-dependent manner in an in vivo xenograft model for melanoma suggested the use of *GLI1* as a mechanistic biomarker of response. Knock-down of GLI1 expression leads to apoptosis via downregulation of BCL-2 and BCL-xl expression⁶¹. QN-302 has been shown to induce apoptosis in vivo⁴², consistent with these other studies.



Figure 6. The interaction energies of (**a**) CM03, (**b**) SOP1247 and (**c**) QN303, as calculated from the 1000 ns molecular dynamics simulations. An extended region of higher binding energy for QN-302 is apparent for much of the simulation.

Materials and methods G4 ligands

Syntheses of compounds CM03 and QN-302 have been previously described^{40,42}. All compounds were used for biophysical and biological studies as their 99% pure free bases.

Gene	QN-302 in MIA-PaCa2	SOP1247 in MIA-PaCa2	CM03 in MIA-PaCa2	CM03 in MIA-PaCa2-GemR	CM03 in PANC-1	PQS
KIF7	-0.62	-1.46	-1.32	-1.34	-0.67	13
SMO	-0.86	-1.42	-1.21	-0.33*	-0.82	12
SUFU	-0.22	-0.16	-0.26	-0.14*	0.12*	20
GLI1	-1.86	-0.13	-0.64	-0.59*	-0.57	15

Table 4. Log₂FC values for genes in the Hedgehog pathway down regulated by QN-302, for 24 h exposure, together with numbers of Putative G-quadruplex Sequences (PQS), from Ref.⁴². CM03-R is the gemcitabine-resistant MIA-PaCa2 and CM03-PANC is the PANC-1 cell line. All *P* values are <0.05, apart from those marked^{*}.

Synthesis of SOP1247

SOP1247 was synthesized and purified using the analogous procedure to QN-302, with a methoxy substitution on the naphthalene diimide core instead of the phenyl-substituted 2-(pyrrolidin-1-yl)ethyl)amino group in QN-302 (Fig. 1).

NaOMe (0.5 M in THF) (843 µl, 0.422 mmol) was added to a solution of 4-bromo-2,7-bis(3-morpholinopropyl)-9-((2-(pyrrolidin-1-yl)ethyl)amino) benzo[lmn][3,8] phenanthroline-1,3,6,8(2H,7H)-tetraone (100 mg, 0.141 mmol) and copper(I) iodide (53.5 mg, 0.281 mmol) under N₂ in THF (1 mL) and stirred at 60 °C for 2 h. The reaction was partitioned between water (10 mL) and DCM (10 mL) and the layers separated via a hydrophobic frit. The aqueous layer was extracted with DCM (2×2 mL) and the combined organic extractions concentrated *in vacuo*. The crude product was purified by chromatography on silica gel (12 g column, 0–8% (0.7 M Ammonia/MeOH)/DCM, liquid load in DCM) to afford 4-methoxy-2,7-bis(3-morpholinopropyl)-9-((2-(pyrrolidin-1-yl)ethyl)amino)benzo[lmn][3,8]phenanthroline-1,3,6,8(2H,7H)-tetraone (31 mg, 0.043 mmol, 31% yield) as a dark fuchsia solid.

¹H NMR in CDCl₃ 1871-29-P1 was consistent with product structure at 92% purity. ¹H NMR (400 MHz, Chloroform-d) δ 9.99 (t, J = 5.4 Hz, 1H), 8.39 (s, 1H), 8.30 (s, 1H), 4.35–4.24 (m, 4H), 4.23 (s, 3H), 3.80 (s, 2H), 3.71–3.58 (m, 8H), 3.01 (t, J = 6.4 Hz, 2H), 2.79 (s, 4H), 2.55 (td, J = 6.9, 2.7 Hz, 4H), 2.49 (s, 8H), 2.03–1.88 (m, 8H). Contains ca. 8 mol% of the starting bromide. UPLC, Basic, 1871-29-P1, m/z 663.1 [M⁺H]⁺ (ES⁺); at 1.38 min, 99% purity @ 210–400 nm.

NMR and mass spectra are available in the Supplementary Data. The mass spectral peak at 663.648 Da corresponds to the molecular weight of the unfragmented pure compound.

SRB assays

Cell lines (MIA-PaCa2, PANC-1, BxPC-3 and Capan-1) were purchased from ATCC (cat #: CRL-1420, CRL-1469, CRL-1687 and HTB-79). The former two cell lines were maintained in DMEM and the latter two cell lines in RPMI-1640 and IMEM, respectively. All media were supplemented with 10% foetal bovine serum (FBS) (ThermoFisher, cat #: 10270106), 2 mM L-glutamine (Sigma-Aldrich, cat #: D6429), 0.1 mg/ml streptomycin and 100 U/ml penicillin (Sigma-Aldrich, cat #: P4333). Specifically, MIA-PaCa2 medium was also supplemented with 2.5% horse serum (ThermoFisher, cat #: 16050130) and Capan-1 medium with extra 10% FBS to make 20% in total. The gemcitabine resistant MIA-PaCa2 cells were generated by incremental increases of gemcitabine concentration and were maintained in the same culture conditions as parental MIA-PaCa2. Cell lines were maintained at 37 °C, 5% CO₂ and passaged or their media were changed every 2–3 days. The cell lines were routinely tested to ensure that they were mycoplasma-free by an RT-qPCR-based method. Briefly, cells were seeded at appropriate densities into the wells of 96-well plates in their corresponding medium and incubated overnight to allow the cells to attach. Subsequently cells were exposed to freshly made solutions of drugs and incubated for a further 96 h. Drugs were dissolved in H₂O, with the judicious addition of a few drops of 0.1 M HCL to facilitate solubilization, and then filtered through 0.22 µm pore-size filter units (stock 10 mM) before addition to appropriate cell line media in quadruplicate at a range of final concentrations. Cellular growth inhibition was measured using the sulforhodamine B (SRB) assay in 96 well plates as described previously³⁷. 50% inhibitory concentrations (GI₅₀) were determined by taking the mean absorbance at 540 nm for each drug concentration expressed as a percentage of the absorbance of untreated control wells.

G4 melting assays

FRET DNA melting assays on CM03, SOP1247 and QN-302 were performed using a fluorescence resonance energy transfer (FRET) assay⁴³. The labelled oligonucleotide had the fluorophores FAM (6-carboxyfluorescein) as donor and fluorophore TAMRA (6-carboxytetramethyl-rhodamine) attached as acceptor. The sequence used was: Human telomeric G4: 5'-FAM-d(GGG[TTAGGG]₃)-TAMRA-3'

The detailed protocol was as previously described³⁸, with a 60 mM potassium cacodylate buffer (pH 7.4).

RNA-seq analysis of RNA from cell-based studies

The methodology used has been previously reported in detail⁴⁰ and the process of determining changes in transcription on exposure of PDAC cells to the compounds has been fully described. The RNA-seq data sets are available in the GEO public functional genomics data repository (https://www.ncbi.nlm.nih.gov/geo/), as

GSE151741 for QN-302 GSE234779 for SOP1247 GSE105083 for CM03 in MIA-PaCa2 cells GSE148200 for CM03 in gemcitabine-resistant MIA-PaCa2 cells GSE105083 for CM03 in PANC-1 cells

RNA-seq analyses have been previously reported^{40–42} for all the above apart for compound SOP1247. The experimental and analytical protocols used in this instance were identical to those used for the other compounds.

Bioinformatics analysis

Prior to clustering analysis, the gene expression data files were filtered to include only genes that met specific significance criteria, using purpose-written PYTHON scripts. Genes with $\log_2 FC < -0.5$ or >0.5 and a FDR < 0.05 to eliminate any that are unlikely to be statistically significant, were retained for further analysis. For G4-drug datasets, downregulation patterns were emphasized on the basis that these were the consequence of G4 promoter targeting. In the hierarchical clustering analysis, we focused on downregulated genes specifically in QN-302 ($\log_2 FC < -0.5$ and FDR < 0.05). Log_2FC values were set to 0, if they were not significant (FDR < 0.05) to focus clustering on statistically significant DEGs only. Hierarchical clustering was performed using Ward's linkage method with the Manhattan distance protocol (the sum of the right-left clustering plus the sum of all the up-down clustering) as the similarity metric. The hierarchical clustering was implemented using the ComplexHeatmap package⁶², version 2.14.0 R (https://bioconductor.org/packages/release/bioc/html/ComplexHeatmap.html). After hierarchical clustering was completed, the resulting dendrogram was analyzed to identify distinct clusters of genes based on their expression patterns. We started by cutting the dendrogram tree into nine clusters.

The number of putative G4 sequences (PQS) in an individual gene were estimated from the occurrence of the canonical G4 motif ($G_{\geq 3}N_{1-7}G_{\geq 3}N_{1-7}G_{\geq 3}N_{1-7}G_{\geq 3}$). The same criterion was used for gene promoter sequences (defined as being up to 2 kilobases upstream of the transcription start site (TSS) and 100 bases downstream) and in exons and introns⁴⁰⁻⁴².

Molecular modelling and dynamics simulations

A molecular model for QN-302 docked into the junction of a parallel G-quadruplex-duplex crystal structure⁶³, has been previously described⁴⁴ and was used here. This employed the crystal structure of the parallel stranded quadruplex⁶⁴ formed from the human telomeric sequence and its complex with the earlier-generation naphthalene diimide compound MM41³⁸ (PDB entry 3UYH) as starting models to assess how QN-302 interacts with parallel topology quadruplexes in general⁶⁵. The docking used MolSoft ICM 3.9-3a software (https://www.molso ft.com/). The structures of compounds CM03 and SOP1247 were generated in the low-energy position found for QN-302. No potentially disruptive non-bonded interactions were apparent. Analyses and visualizations were undertaken with the program ChimeraX (https://www.cgl.ucsf.edu/chimeraX/). The docked complexes were then subjected to molecular dynamics simulations in explicit solvent. The ligands were parameterized using the GAFF forcefield⁶⁶, while the nucleic acids were described using the ParmBsc1 force field with OL15 modifications⁶⁷. The two K+ ions in the G-quadruplex were treated as a part of the structure. Each system was solvated in a cubic box containing TIP3P water molecules⁶⁸ and 100 mM KCl⁶⁹. The complexes were minimized for 3000 steps of steepest descent and equilibrated for 5 ns before the production run. During the equilibration step, each system was slowly heated to 300 K in an NPT ensemble. The Langevin thermostat and Berendsen barostat were used to stabilize the temperature and pressure respectively. The final production run was set to 1000 ns in the NVT ensemble. All the simulation protocols were identical and were run using the ACEMD v3.5 MD engine⁷⁰. The interaction free energy between the ligand and the DNA was calculated using the NaMD energy plugin implemented in the VMD package⁷¹.

Data availability

All transcriptome data sets have been deposited and are publicly available from the GEO public functional genomics data repository (https://www.ncbi.nlm.nih.gov/geo/).

Received: 21 November 2023; Accepted: 8 February 2024 Published online: 11 February 2024

References

- 1. Gellert, M., Lipsett, M. N. & Davies, D. R. Helix formation by guanylic acid. Proc. Natl. Acad. Sci. USA 48, 2013–2018 (1962).
- 2. Burge, S., Parkinson, G. N., Hazel, P., Todd, A. K. & Neidle, S. Quadruplex DNA: sequence, topology and structure. *Nucleic Acids Res.* 34, 5402–5415 (2006).
- Bochman, M. L., Paeschke, K. & Zakian, V. A. DNA secondary structures: stability and function of G-quadruplex structures. Nat. Rev. Genet. 13, 770–780 (2012).
- 4. Spiegel, J., Adhikari, S. & Balasubramanian, S. The structure and function of DNA G-quadruplexes. *Trends Chem.* 2, 123–136 (2019).
- 5. Winnerdy, F. R. & Phan, A. T. Quadruplex structure and diversity. Ann. Rep. Med. Chem. 54, 45-73 (2020).
- Todd, A. K., Johnston, M. & Neidle, S. Highly prevalent putative quadruplex sequence motifs in human DNA. Nucleic Acids Res. 33, 2901–2907 (2005).
- Huppert, J. L. & Balasubramanian, S. Prevalence of quadruplexes in the human genome. *Nucleic Acids Res.* 33, 2908–2916 (2005).
 Siddiqui-Jain, A., Grand, C. L., Bearss, D. J. & Hurley, L. H. Direct evidence for a G-quadruplex in a promoter region and its
- targeting with a small molecule to repress c-MYC transcription. Proc. Natl. Acad. Sci. USA 99, 11593–11598 (2002).
 Huppert, J. L. & Balasubramanian, S. G-quadruplexes in promoters throughout the human genome. Nucleic Acids Res. 35, 406–413 (2007).

- Balasubramanian, S., Hurley, L. H. & Neidle, S. Targeting G-quadruplexes in gene promoters: A novel anticancer strategy?. Nat. Rev. Drug Discov. 10, 261–275 (2011).
- Rigo, R., Palumbo, M. & Sissi, C. G-quadruplexes in human promoters: A challenge for therapeutic applications. *Biochim. Biophys.* Acta 1861, 1399–1413 (2017).
- 12. Hansel-Hertsch, R. et al. G-quadruplex structures mark human regulatory chromatin. Nat. Genet. 48, 1267-1272 (2016).
- Lago, S. et al. Promoter G-quadruplexes and transcription factors cooperate to shape the cell type-specific transcriptome. Nat. Commun. 12, 3885 (2021).
- 14. Shen, J. et al. Promoter G-quadruplex folding precedes transcription and is controlled by chromatin. Genome Biol. 22, 143 (2021).
- 15. Romano, F. *et al.* G-quadruplexes in cancer-related gene promoters: from identification to therapeutic targeting. *Expert Opin. Ther. Pat.* **19**, 1–29 (2023).
- 16. Alessandrini, I., Recagni, M., Zaffaroni, N. & Folini, M. On the road to fight cancer: the potential of G-quadruplex ligands as novel therapeutic agents. *Int. J Mol. Sci.* 22, 5947 (2021).
- 17. Kosiol, N., Juranek, S., Brossart, P., Heine, A. & Paeschke, K. G-quadruplexes: A promising target for cancer therapy. *Mol. Cancer.* 20, 40 (2021).
- Mendes, E., Aljnadi, I. M., Bahls, B., Victor, B. L. & Paulo, A. major achievements in the design of quadruplex-interactive small molecules. *Pharmaceuticals (Basel)* 15, 300 (2022).
- 19. Neidle, S. Quadruplex nucleic acids as novel therapeutic targets. J. Med. Chem. 59, 5987-6011 (2016).
- Boddupally, P. V. *et al.* Anticancer activity and cellular repression of c-MYC by the G-quadruplex-stabilizing 11-piperazinylquindoline is not dependent on direct targeting of the G-quadruplex in the c-MYC promoter. *J. Med. Chem.* 55, 6076–6086 (2012).
- Calabrese, D. R. et al. Chemical and structural studies provide a mechanistic basis for recognition of the MYC G-quadruplex. Nat. Commun. 9, 4229 (2018).
- 22. Wang, K. B. *et al.* Indenoisoquinoline topoisomerase inhibitors strongly bind and stabilize the MYC promoter G-quadruplex and downregulate MYC. *J. Am. Chem. Soc.* **141**, 11059–11070 (2019).
- Lavrado, J. *et al.* KRAS oncogene repression in colon cancer cell lines by G-quadruplex binding indolo[3,2-c]quinolines. Sci. Rep. 5, 9696 (2015).
- 24. Brito, H. *et al.* KRAS oncogene in colon cancer cells with 7-carboxylate indolo[3,2-b]quinoline tri-alkylamine derivatives. *PLoS ONE* **10**, e0126891 (2015).
- Wang, X.-D. et al. Turning off transcription of the bcl-2 gene by stabilizing the bcl-2 promoter quadruplex with quindoline derivatives. J. Med. Chem. 53, 4390–4398 (2010).
- 26. Nadai, M. *et al.* Assessment of gene promoter G-quadruplex binding and modulation by a naphthalene diimide derivative in tumor cells. *Int. J. Oncol.* **46**, 369–380 (2015).
- 27. Spinello, A., Barone, G. & Grunenberg, J. Molecular recognition of naphthalene diimide ligands by telomeric quadruplex-DNA: The importance of the protonation state and mediated hydrogen bonds. *Phys. Chem. Chem. Phys.* **18**, 2871–2877 (2016).
- Lopergolo, A. et al. Targeting of RET oncogene by naphthalene diimide-mediated gene promoter G-quadruplex stabilization exerts anti-tumor activity in oncogene-addicted human medullary thyroid cancer. Oncotarget 7, 49649–49663 (2016).
- Recagni, M. et al. Distinct biological responses of metastatic castration resistant prostate cancer cells upon exposure to G-quadruplex interacting naphthalenediimide derivatives. Eur. J. Med. Chem. 177, 401–413 (2019).
- Pirota, V., Nadai, M., Doria, F. & Richter, S. N. Naphthalene diimides as multimodal G-quadruplex-selective ligands. *Molecules* 24, 426 (2019).
- Platella, C., Napolitano, E., Riccardi, C., Musumeci, D. & Montesarchio, D. Disentangling the structure-activity relationships of naphthalenediimides as anticancer G-quadruplex-targeting drugs. J. Med. Chem. 64, 3578–3603 (2021).
- 32. Pérez-Soto, M. *et al.* Structure-activity relationship studies on divalent naphthalene diimide G quadruplex ligands with anticancer and antiparasitic activity. *Bioorg. Med. Chem.* **71**, 116946 (2022).
- Gunaratnam, M. et al. A naphthalene diimide G-quadruplex ligand inhibits cell growth and down-regulates BCL-2 expression in an imatinib-resistant gastrointestinal cancer cell line. Bioorg. Med. Chem. 26, 2958–2964 (2018).
- 34. Cuenca, F. *et al.* Tri- and tetra-substituted naphthalene diimides as potent G-quadruplex ligands. *Bioorg. Med. Chem. Lett.* 18, 1668–1673 (2008).
- Hampel, S. M., Sidibe, A., Gunaratnam, M., Riou, J.-F. & Neidle, S. Tetrasubstituted naphthalene diimide ligands with selectivity for telomeric G-quadruplexes and cancer cells. *Bioorg. Med. Chem. Lett.* 20, 6459–6463 (2010).
- 36. Gunaratnam, M. et al. Targeting pancreatic cancer with a G-quadruplex ligand. Bioorg. Med. Chem. 19, 7151-7157 (2011).
- 37. Collie, G. W. et al. Structural basis for telomeric G-quadruplex naphthalene diimide ligand targeting. J. Am. Chem. Soc. 134, 2723–2731 (2012).
- Micco, M. et al. Structure-based design and evaluation of naphthalene diimide G-quadruplex ligands as telomere targeting agents in pancreatic cancer cells. J. Med. Chem. 56, 2959–2974 (2013).
- 39. Ohnmacht, S. A. *et al.* A G-quadruplex-binding compound showing anti-tumour activity in an in vivo model for pancreatic cancer. *Sci. Rep.* **5**, 11385 (2015).
- Marchetti, C. *et al.* Targeting multiple effector pathways in pancreatic ductal adenocarcinoma with a G-quadruplex-binding small molecule. *J. Med. Chem.* 61, 2500–2517 (2018).
- 41. Ahmed, A. A., Marchetti, C., Ohnmacht, S. A. & Neidle, S. A G-quadruplex-binding compound shows potent activity in human gemcitabine-resistant pancreatic cancer cells. *Sci. Rep.* **10**, 12192 (2020).
- Ahmed, A. A. et al. Asymmetrically substituted quadruplex-binding naphthalene diimide showing potent activity in pancreatic cancer models. ACS Med. Chem. Lett. 11, 1634–1644 (2020).
- 43. Vo, T. et al. Substituted naphthalenediimide compounds bind selectively to two human quadruplex structures with parallel topology. ACS. Med. Chem. Lett. 11, 991–999 (2020).
- 44. Ahmed, A. A. *et al.* The potent G-quadruplex-binding compound QN-302 downregulates S100P gene expression in cells and in an in vivo model of pancreatic cancer. *Molecules.* **28**, 2452 (2023).
- 45. Paradise, B. D. *et al.* promotes GLI activity in a Hedgehog-independent manner in pancreatic cancer. *Biochem. J.* **480**, 1199–1216 (2023).
- Vera, R. E. et al. GL11 interaction with p300 modulates SDF1 expression in cancer-associated fibroblasts to promote pancreatic cancer cells migration. *Biochem. J.* 480, 225–241 (2023).
- Maresca, L. et al. Targeting GLI1 and GLI2 with small molecule inhibitors to suppress GLI-dependent transcription and tumor growth. Pharmacol. Res. 195, 106858 (2023).
- Rabiei, N., Soltanian, A. R., Farhadian, M. & Bahreini, F. the performance evaluation of the random forest algorithm for a gene selection in identifying genes associated with resectable pancreatic cancer in microarray dataset: A retrospective study. *Cell J.* 25, 347–353 (2023).
- 49. Quatannens, D. et al. Targeting hedgehog signaling in pancreatic ductal adenocarcinoma. Pharmacol. Ther. 236, 108107 (2022).
- Wang, K. et al. Involvement of elevated ASF1B in the poor prognosis and tumorigenesis in pancreatic cancer. Mol. Cell Biochem. 477, 1947–1957 (2022).
- 51. Kim, J. H. *et al.* Downregulation of ASF1B inhibits tumor progression and enhances efficacy of cisplatin in pancreatic cancer. *Cancer Biomark.* **34**, 647–659 (2022).

- 52. Zhang, M. *et al.* Anti-silencing function 1B promotes the progression of pancreatic cancer by activating c-Myc. *Int. J. Oncol.* **62**, 8 (2023).
- 53. Chao, D. *et al.* Stomatin-like protein 2 induces metastasis by regulating the expression of a rate-limiting enzyme of the hexosamine biosynthetic pathway in pancreatic cancer. *Oncol. Rep.* **45**, 90 (2021).
- Hao, W., Zhang, Y., Dou, J., Cui, P. & Zhu, J. S100P as a potential biomarker for immunosuppressive microenvironment in pancreatic cancer: A bioinformatics analysis and in vitro study. *BMC Cancer* 23, 997 (2023).
- 55. Zou, W. *et al.* Up-regulation of S100P predicts the poor long-term survival and construction of prognostic signature for survival and immunotherapy in patients with pancreatic cancer. *Bioengineered* **12**, 9006–9020 (2021).
- 56. Matsunaga, T. *et al.* S100P in duodenal fluid is a useful diagnostic marker for pancreatic ductal adenocarcinoma. *Pancreas* **46**, 1288–1295 (2017).
- 57. Wu, Y. et al. S100 proteins in pancreatic cancer: Current knowledge and future perspectives. Front. Oncol. 11, 711180 (2021).
- Srivastava, K., Lines, K. E., Jach, D. & Crnogorac-Jurcevic, T. S100PBP is regulated by mutated KRAS and plays a tumour suppressor role in pancreatic cancer. Oncogene 42, 3422–3434 (2023).
- 59. Lin, M. *et al.* S100P contributes to promoter demethylation and transcriptional activation of SLC2A5 to promote metastasis in colorectal cancer. *Br. J. Cancer* **125**, 734–747 (2021).
- 60. Camara, R. *et al.* Discovery of novel small molecule inhibitors of \$100P with in vitro anti-metastatic effects on pancreatic cancer cells. *Eur. J. Med. Chem.* **203**, 112621 (2020).
- 61. Sun, Y. *et al.* Gli1 inhibition suppressed cell growth and cell cycle progression and induced apoptosis as well as autophagy depending on ERK1/2 activity in human chondrosarcoma cells. *Cell Death Dis.* **5**, e979 (2014).
- Gu, Z., Eils, R. & Schlesner, M. Complex heatmaps reveal patterns and correlations in multidimensional genomic data. *Bioinformatics* 32, 2847–2849 (2016).
- 63. Russo Krauss, I., Ramaswamy, S., Neidle, S., Haider, S. & Parkinson, G. N. Structural insights into the quadruplex-duplex 3' interface formed from a telomeric repeat: a potential molecular target. J. Am. Chem. Soc. 138, 1226–1233 (2016).
- 64. Parkinson, G. N., Lee, M. P. & Neidle, S. Crystal structure of parallel quadruplexes from human telomeric DNA. *Nature* 417, 876–880 (2002).
- 65. Neidle, S. Structured waters mediate small molecule binding to G-quadruplex nucleic acids. Pharmaceuticals (Basel) 15, 7 (2021).
- Wang, J., Wolf, R. M., Caldwell, J. W., Kollman, P. A. & Case, D. A. Development and testing of a general amber force field. J. Comput. Chem. 25, 1157–1174 (2004).
- 67. Zgarbova, M. *et al.* Refinement of the sugar-phosphate backbone torsion beta for the AMBER force fields improves the description of Z-DNA and B-DNA. *J. Chem. Theory Comput.* **11**, 5723–5736 (2015).
- Jorgensen, W. L., Chandrasekhar, J., Madura, J. D., Impey, R. W. & Klein, M. L. Comparison of simple potential functions for simulating liquid water. J. Chem. Phys. 79, 926–935 (1983).
- Joung, I. S. & Cheatham, T. E. 3rd. Determination of alkali and halide monovalent ion parameters for use in explicitly solvated biomolecular simulations. J. Phys. Chem. B. 112, 9020–9041 (2008).
- Harvey, M. J., Giupponi, G. & Fabritiis, G. D. ACEMD: Accelerating biomolecular dynamics in the microsecond time scale. J. Chem. Theory Comput. 5, 1632–1639 (2008).
- 71. Humphrey, W., Dalke, A. & Schulten, K. VMD-Visual molecular dynamics. J. Mol. Graph. 14, 33-38 (1996).

Acknowledgements

This project was part of a programme supported by the UCL Technology Fund, the Medical Research Council and the Wellcome Trust.

Author contributions

A.A.A. Formal analysis, validation, transcriptome investigation, writing, reviewing and editing. M.R.E. Formal analysis, transcriptome investigation. R.A. and S.O. Formal analysis, validation of chemistry, reviewing and editing. M.M., N.B. and M.S., detailed compound synthesis and characterization, D.N. formal analysis, bioinformatics investigation. T.A. Formal analysis, reviewing and editing. S.H. and S.C. modelling, reviewing and editing S.N. Conceptualization, formal analysis, supervision, investigation, writing, reviewing and editing.

Competing interests

Stephen Neidle is a paid consultant and member of the scientific advisory board of Qualigen Therapeutics Inc. Tariq Arshad is an employee of Qualigen Therapeutics Inc.

Additional information

Supplementary Information The online version contains supplementary material available at https://doi.org/10.1038/s41598-024-54080-2.

Correspondence and requests for materials should be addressed to S.N.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by/4.0/.

© The Author(s) 2024