

1 **Prioritization of drug targets for neurodegenerative diseases by integrating genetic and proteomic data from**  
2 **brain and blood**

3 **Running title: Identifying drug targets for neurodegenerative diseases**

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22 proteomics

23 **Abstract**

24 **Background:** Neurodegenerative diseases are among the most prevalent and devastating neurological  
25 disorders, with few effective prevention and treatment strategies. We aimed to integrate genetic and  
26 proteomic data to prioritize drug targets for neurodegenerative diseases.

27 **Methods:** We screened human proteomes through Mendelian randomization to identify causal mediators  
28 of Alzheimer's disease (AD), Parkinson's disease (PD), amyotrophic lateral sclerosis (ALS), multiple  
29 sclerosis (MS), frontotemporal dementia, and Lewy body dementia. For instruments, we used brain and  
30 blood protein quantitative trait loci (pQTLs) identified from one GWAS with 376 individuals and another  
31 with 3,301, respectively. Causal associations were subsequently validated by sensitivity analyses and  
32 colocalization. The safety and druggability of identified targets were also evaluated.

33 **Results:** Our analyses showed targeting BIN1, GRN, and RET levels in blood, as well as ACE, ICA1L,  
34 MAP1S, SLC20A2, and TOM1L2 levels in brain might reduce AD risk, while ICA1L, SLC20A2, and  
35 TOM1L2 were not recommended as prioritized drugs due to the identified potential side-effects. Brain  
36 CD38, DGKQ, GPNMB, and SEC23IP were candidate targets for PD. Among them, GPNMB was the  
37 most promising target for PD with their causal relationship evidenced by studies on both brain and blood  
38 tissues. Interventions targeting FCRL3, LMAN2, MAPK3 in blood and DHRS11, FAM120B, SHMT1,  
39 TSFM in brain might affect MS risk. The risk of ALS might be reduced by medications targeting DHRS11,  
40 PSMB3, SARM1, and SCFD1 in brain.

41 **Conclusions:** Our study prioritized 22 proteins as targets for neurodegenerative diseases and provided  
42 preliminary evidence for drug development. Further studies are warranted to validate these targets.

## 43 Introduction

1  
2  
3 44 Neurodegenerative diseases, characterized by the progressive loss of vulnerable neurons and brain  
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5 45 function decline, are a group of age-related disorders with highly heterogeneous pathophysiologies and  
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7 46 clinical presentations (1). Since life expectancy has increased dramatically, neurodegenerative diseases  
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9 47 have become more devastating and burdensome than ever before (2). Despite the compelling clinical need,  
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11 48 effective therapeutic and prevention strategies for neurodegenerative diseases are rarely available in  
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13 49 clinical practice. Besides, an incredibly high drug development failure rate was observed for  
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15 50 neurodegenerative diseases (3). Fortunately, it has been shown that drug targets supported by human  
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17 51 genetic evidence are more likely to succeed in clinical trials (4). Mendelian randomization (MR) is an  
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19 52 analytic approach that uses genetic variants as instruments to infer causal relationships between exposures  
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21 53 and outcomes. As genetic variants are randomly allocated at conception, the MR approach is less likely to  
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23 54 be affected by confounding factors and reverse causality than observational studies, thus it has been  
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25 55 considered a “natural” randomized controlled trial (RCT).

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29 56 Human proteins play direct roles in biological processes and constitute the primary source of drug  
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31 57 targets. Recent proteomic studies have identified an abundance of protein quantitative trait loci (pQTLs) in  
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33 58 both blood and brain, enabling MR analysis at the proteomic level (5, 6). Proteomic data derived from  
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35 59 brain and blood each have their own advantages. The human proteome in brain is more closely associated  
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37 60 with the pathology of neurodegenerative disorders in the central nervous system, and the abundance of  
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39 61 blood proteins is easier to be directly controlled by medications due to the blood-brain barrier. Hence,  
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41 62 taking both brain and blood proteomic data into account would provide new insights into the drug  
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43 63 development. In addition, it has been revealed that pQTLs located in the vicinity of the encoding genes,  
44  
45 64 namely *cis*-pQTLs, are more likely to influence the protein level by directly influencing the transcription  
46  
47 65 or translation. In contrast, *trans*-pQTLs might influence the protein level via indirect mechanisms (7).  
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50 66 Thus, the use of *cis*-pQTLs for analysis would substantially minimize the pleiotropy caused by indirect  
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52 67 pathways.

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55 68 Here, we integrated genetic and proteomic data from the brain and blood to prioritize genetically-  
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57 69 supported drug targets for neurodegenerative diseases. By combining state-of-the-art methods, we assessed  
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59 70 the causal relationships between human proteomes and neurodegenerative diseases after taking  
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71 consistency, pleiotropy, confounding, aptamer-binding effect, linkage, and reverse causality into account  
72 (Figure S1). The potential on-target side-effects and druggability of the identified targets were also  
73 evaluated.

## 74 **Methods and Materials**

### 75 **Study design**

76 This study was based on publicly available summary data of QTLs and neurodegenerative diseases  
77 (Table S1). Data were collected from November 2020 to June 2021 and analyzed in 2021. A flow chart of  
78 the overall study design is presented in Figure 1. Firstly, we selected independent *cis*-pQTLs from  
79 comprehensive pQTL datasets as instruments and filtered the instruments via consistency and specificity  
80 tests. Secondly, we screened the human proteomes through MR to identify candidate causal mediators of  
81 neurodegenerative diseases. Thirdly, the identified causal relationships were further validated by multi-*cis*  
82 analysis, as well as the heterogeneity, pleiotropy, and directional tests. Fourthly, we investigated whether  
83 the protein and the disease share a common causal variant by Bayesian colocalization. Fifthly, replication  
84 and correlation analyses were conducted to estimate the consistency of results within and across brain and  
85 blood. Sixthly, we summarized the evidence of causality for all candidate drug targets and expanded our  
86 analysis pipeline to the phenome-wide to evaluate the safety by predicting the side-effects resulting from  
87 targeting the proteins. Finally, the druggability of the prioritized protein targets was checked according to  
88 two large databases.

### 89 **Data Sources**

90 The discovery brain pQTL data were generated from post-mortem samples of the dorsolateral  
91 prefrontal cortex (dPFC) donated by 376 individuals in ROS/MAP (8). The proteomic profiles included  
92 8,356 proteins labeled by isobaric tandem mass tag peptide and analyzed by liquid chromatography  
93 coupled to mass spectrometry (LC-MS) (9, 10). The discovery blood pQTL data originated from the  
94 INTERVAL study, and the proteomic profiles were generated from 3,301 blood donors and included 3,622  
95 plasma proteins measured by SOMAscan (5). We also obtained two brain and two blood pQTL datasets  
96 from independent cohorts for replication (11, 12), as well as an eQTL data for the analysis of aptamer-  
97 binding effects (13). Details of the replication datasets are presented in the Supplementary Methods.

98 The summary statistics of GWAS for Alzheimer's disease (AD,  $n_{\text{cases}} = 75,024$ ,  $n_{\text{controls}} = 397,844$ )  
99 (14), Parkinson's disease (PD,  $n_{\text{cases}} = 33,674$ ,  $n_{\text{controls}} = 449,056$ ) (15), amyotrophic lateral sclerosis (ALS,  
100  $n_{\text{cases}} = 27,205$ ,  $n_{\text{controls}} = 110,881$ ) (16), multiple sclerosis (MS,  $n_{\text{cases}} = 14,802$ ,  $n_{\text{controls}} = 26,703$ ) (17),  
101 frontotemporal dementia (FTD,  $n_{\text{cases}} = 2,154$ ,  $n_{\text{controls}} = 4,308$ ) (18), and Lewy body dementia (LBD,  $n_{\text{cases}}$   
102  $= 2,981$ ,  $n_{\text{controls}} = 2,173$ ) (19) were obtained from large consortia. All individuals of GWAS included in  
103 this study were of predominantly European descent. No sample overlap between QTL datasets and GWAS  
104 for neurodegenerative diseases was detected. Detailed descriptions of all GWAS used in this study can be  
105 found in Table S1.

### 106 **Instrument selection and validation**

107 We first mapped the genetic variants to genome build GRCh37/hg19 and selected *cis*-pQTLs from the  
108 brain and blood proteomes according to Ensembl v104 (<http://grch37.ensembl.org>). The *cis*-pQTLs were  
109 defined as genome-wide significant ( $P < 5 \times 10^{-8}$ ) and LD-independent genetic variants fell within 500 kb  
110 upstream or downstream of the transcription start site of the gene encoding the protein. LD clumping was  
111 achieved based on  $r^2 < 0.001$  using the 1000G European reference panel. All rare variants with minor allele  
112 frequency (MAF) less than 0.01 were excluded from further analysis. Variants located within the human  
113 major histocompatibility complex region (chr6:26-34MB) were removed before analysis.

114 Next, we performed the cross-study consistency and specificity tests to validate the identified  
115 instruments. We checked the LD of sentential *cis*-pQTLs and the direction of effect estimates to evaluate  
116 the instrument consistency across proteomic studies. For instrument specificity, the number of proteins  
117 associated with each instrument ( $P < 5 \times 10^{-8}$ ) was counted. If an instrument and its proxies ( $r^2 > 0.8$ ) were  
118 associated with more than five proteins, the instrument was considered highly pleiotropic and thus  
119 excluded from further analysis. The PhenoScanner was used to help identify other known genotype-protein  
120 associations in blood (9, 11, 20-23). We manually counted the number of brain proteins associated with  
121 each instrument (6, 9, 24). Specifically, if *cis*-pQTL data from more than one SOMAmer reagent of a  
122 certain protein were available, we chose the reagent with the highest instrument consistency and  
123 specificity. If different SOMAmers shared the same *cis*-pQTL, we would select the one with the lowest *P*-  
124 value for the following analysis. Instrument strength was measured by the F-statistic, while an F-statistic of  
125 at least 10 indicates the instrument is not weak (25).

## 126 **Mendelian randomization**

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2  
3 127 After validation of the genetic instruments, we extracted the effect estimates of the same variants or  
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5 128 their proxies in GWAS of neurodegenerative diseases for data harmonization. The primary MR analysis  
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7 129 was performed using the Wald ratio or inverse-variance weighted (IVW) method, depending on the  
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9 130 number of independent *cis*-pQTLs for each protein. Bonferroni correction for the number of proteins was  
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11 131 conducted to control multiple comparisons (Bonferroni threshold: 0.05/608 for brain and 0.05/613 for  
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13 132 blood).

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16 133 MR results with a single instrument of a protein might be distorted if the instrument was an outlier.  
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18 134 To address this concern and boost statistical power, we next conducted the multi-*cis* MR analysis using  
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20 135 *cis*-acting genome-wide significant instruments in weak LD ( $r^2 < 0.6$ ) for the associations identified by  
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22 136 primary analysis (clumping at  $r^2 < 0.001$ ) (26). Multiple MR analytical approaches, including IVW, Egger,  
23  
24 137 weighted median, and weighted mode were applied for validation, of which IVW was chosen as the  
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26 138 primary approach according to the recommendation (27). The heterogeneity was quantified by the IVW Q  
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28 139 statistic, and the pleiotropy was evaluated by the MR-Egger intercept. The causal direction was assessed  
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30 140 by two analytical approaches, the Steiger filtering and the reverse MR. Reverse MR could only be  
31  
32 141 performed with blood proteins due to data accessibility. In the validation, heterogeneity, pleiotropy, and  
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34 142 directional analyses, uncorrected *P*-values less than 0.05 were considered significant. All MR analyses  
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36 143 were undertaken with the “TwoSampleMR” package in R (28).

## 40 144 **Sensitivity analysis considering the aptamer-binding effects**

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43 145 As the blood proteins were measured by SOMAmers and were susceptible to aptamer-binding effects,  
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45 146 we looked up the function of blood pQTL variants and their proxies in HaploReg v4.1 (29). Sensitivity  
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47 147 analysis was performed after excluding all missense variants and variants in high LD ( $r^2 > 0.8$ ) with  
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49 148 missense variants. Subsequently, we performed a transcriptional level MR using blood eQTL to validate  
50  
51 149 the association. eQTL data measured by RNA sequencing are less likely to be confounded by aptamer-  
52  
53 150 binding effects.

## 56 151 **Replication and correlation analyses**

152 To understand the consistency of MR estimates within brain and blood tissues, we performed  
153 replication MR analyses using replication datasets. Gene and protein names in different datasets were  
154 aligned by UniPort ID. We also conducted beta-beta correlation analyses of MR estimates within and  
155 across tissues using the Pearson test via “cor.test” function implemented in R. The correlation analyses  
156 were first undertaken in all proteins and then limited to proteins at the nominal significance level ( $P <$   
157 0.05).

### 158 **Bayesian colocalization**

159 Bayesian colocalization was performed to further strengthen the evidence of causality by calculating  
160 the posterior probability (PP) that the protein and disease share the same causal signal (H4). A posterior  
161 probability for H4 (PP.H4) of at least 50% suggests likely to colocalize, and a PP.H4 of at least 80%  
162 suggests highly likely to colocalize (7). Colocalization analysis was conducted within a 1-MB window on  
163 either side of the sentinel variant by the “coloc” package in R software.

### 164 **Drug target prioritization**

165 After systematically operating the above analytical pipeline, we prioritized the identified drug targets  
166 by their strength of causal evidence, considering the consistency, heterogeneity, pleiotropy, directionality,  
167 and colocalization. Notably, targets with conflicting evidence in multi-*cis* or replication analysis, evidence  
168 of aptamer-binding effects, or not likely to colocalize were rated as having a low level of causality and  
169 were not considered credible targets.

### 170 **Assessment of safety and druggability**

171 Finally, we expanded our analytical pipeline to the phenome-wide to assess the safety of targets by  
172 predicting on-target side-effects. Potential side-effects were extracted from the MRC IEU OpenGWAS  
173 Project (28, 30) with European or predominantly European ethnicity. If the same phenotype was available  
174 in more than one GWAS, we chose the one with the largest sample size to reduce the multiple testing  
175 burden. Similar but not identical phenotypes were retained because the consistent results from similar  
176 phenotypes would gain more confidence in the existence of side-effects. The overall level of safety was  
177 approximated by the sum PP.H4 of all adverse effects passed the Bonferroni correction. The druggability  
178 of each prioritized target was checked according to Finan’s criteria (31) and the DrugBank database (32).

## 179 Results

### 180 Characterizing genetic instruments of protein abundance in brain and blood

181 After applying the prescribed quality control criteria, 616 brain *cis*-pQTLs for 608 proteins and 840  
182 blood *cis*-pQTLs for 611 proteins were available for MR analysis (Tables S2-3). The instruments across  
183 brain pQTL studies showed remarkable consistency, as 92.0% and 71.8% of sentinel *cis*-pQTLs in  
184 ROS/MAP were in high LD ( $r^2 > 0.8$ ) with that in the two replication datasets (Table S4). For the blood  
185 proteome, the sentinel *cis*-pQTLs of 60.1% and 58.8% proteins in INTERVAL were in high LD ( $r^2 > 0.8$ )  
186 with that in two replication cohorts (Table S5). The F-statistic of all instruments ranged from 30 to 1704  
187 (Table S3 and Table S5).

### 188 Mendelian randomization and colocalization in the brain proteome

189 After Bonferroni correction for multiple testing, our primary MR analysis identified 18 proteins  
190 whose abundance in brain was associated with risks of neurodegenerative diseases (Figure 2A, Figure 3A,  
191 and Table S6). Genetically determined higher levels of brain EPHX2 (OR = 1.42,  $P = 2.72 \times 10^{-13}$ ),  
192 TOM1L2 (OR = 3.85,  $P = 2.72 \times 10^{-5}$ ), and MAP1S (OR = 2.36,  $P = 3.17 \times 10^{-5}$ ) were associated with  
193 greater risks of AD, while the genetically determined higher levels of ICA1L (OR = 0.38,  $P = 1.57 \times 10^{-5}$ ),  
194 SLC20A2 (OR = 0.45,  $P = 4.17 \times 10^{-5}$ ) and ACE (OR = 0.55,  $P = 5.76 \times 10^{-5}$ ) were associated with lower  
195 risks of AD. The abundance of brain SCFD1 (OR = 5.42,  $P = 1.02 \times 10^{-14}$ ) and PSMB3 (OR = 2.24,  $P =$   
196  $5.76 \times 10^{-5}$ ) might increase and SARM1 (OR = 0.31,  $P = 8.27 \times 10^{-9}$ ) and DHRS11 (OR = 0.58,  $P =$   
197  $2.16 \times 10^{-5}$ ) might decrease ALS risk. In addition, five proteins in brain would elevate the risk of MS,  
198 including TSFM (OR = 4.87,  $P = 1.38 \times 10^{-10}$ ), GALC (OR = 1.65,  $P = 1.01 \times 10^{-7}$ ), SHMT1 (OR = 1.94,  $P$   
199  $= 1.20 \times 10^{-5}$ ), DHRS11 (OR = 2.22,  $P = 3.02 \times 10^{-5}$ ), and FAM120B (OR = 4.40,  $P = 5.10 \times 10^{-5}$ ).  
200 Genetically predicted high levels of GPNMB (OR = 1.46,  $P = 2.48 \times 10^{-8}$ ) and SEC23IP (OR = 7.88,  $P =$   
201  $2.45 \times 10^{-5}$ ) were associated with an increased PD risk, while high levels of CD38 (OR = 0.32,  $P = 6.99 \times 10^{-$   
202  $14$ ) and DGKQ (OR = 0.14,  $P = 1.97 \times 10^{-9}$ ) were associated with a decreased PD risk. All protein-disease  
203 associations showed the correct causal direction in the Steiger filtering analysis (Table S7). Meanwhile, we  
204 found that the results in multi-*cis* MR were in accordance with the primary analysis and consistent among  
205 multiple MR approaches (Table S8). No pleiotropy was observed, while heterogeneity was detected in  
206 three protein-disease pairs (EPHX2-AD, DHRS11-ALS, and GALC-MS). Bayesian colocalization analysis



207 showed that all protein-disease associations except EPHX2-AD and GALC-MS were likely to be driven by  
208 the same causal SNP (Table S9).

### 209 **Mendelian randomization and colocalization in the blood proteome**

210 After screening the human blood proteome through primary MR analysis, 16 proteins for five diseases  
211 passed the Bonferroni correction (Figure 2B, Figure 3B, and Table S10). No reverse causation was  
212 observed in either the Steiger filtering or reverse MR analysis (Tables S11-12). Seven proteins for AD  
213 were identified in the primary MR, but only four of them showed evidence of colocalization (BIN1, OR =  
214 1.87,  $P = 1.46 \times 10^{-23}$ , PP.H4 = 69.6%; GRN, OR = 0.83,  $P = 2.99 \times 10^{-6}$ , PP.H4 = 99.5%; CD33, OR =  
215 1.06,  $P = 3.69 \times 10^{-5}$ , PP.H4 = 99.8%; RET, OR = 1.18,  $P = 7.87 \times 10^{-5}$ , PP.H4 = 74.7%). Notably, we  
216 observed high heterogeneity ( $P = 1.64 \times 10^{-5}$ ) and pleiotropy ( $P = 5.54 \times 10^{-4}$ ) regarding circulating CD33  
217 levels for AD risk (Table S13). For all FTD subtypes, only the protein WISP1 survived the Bonferroni  
218 correction but did not pass the Bayesian colocalization (Table S14). Circulating  $\alpha$ -synuclein (encoded by  
219 *SNCA*) was highly associated with LBD and PD risks in MR analyses. However, the colocalization results  
220 (PP.H4 = 17.2% and 0.0%) suggested the identified association might be a product of LD but not causality  
221 (Table S14). Other drug targets both passed MR and colocalization analysis including GPNMB (OR =  
222 1.51,  $P = 1.80 \times 10^{-7}$ , PP.H4 = 55.6%) and FCGR2A (OR = 1.06,  $P = 4.72 \times 10^{-5}$ , PP.H4 = 92.4%) for PD,  
223 and FCRL3 (OR = 0.83,  $P = 8.93 \times 10^{-9}$ , PP.H4 = 94.1%), MAPK3 (OR = 0.56,  $P = 4.94 \times 10^{-6}$ , PP.H4 =  
224 71.4%), AHSG (OR = 0.88,  $P = 2.37 \times 10^{-5}$ , PP.H4 = 96.4%), and LMAN2 (OR = 1.56,  $P = 7.19 \times 10^{-5}$ ,  
225 PP.H4 = 83.4%) for MS.

226 As the blood pQTL studies measured proteins by aptamer-based approaches, we next investigated  
227 whether the MR results were confounded by aptamer-binding effects (Table S15). The instruments for  
228 CKM, FCRL3, BAG3, and parts of instruments for CD33 and FCGR2A were known missense variants or  
229 in high LD with missense variants, which were susceptible to aptamer-binding effects. We did a sensitivity  
230 analysis after excluding missense variants in CD33 and FCGR2A, and both analyses yielded non-  
231 significant results. As not all proteins had enough instruments for sensitivity analysis, transcriptional level  
232 MR of blood mRNA abundance was conducted for further validation. We found the increased abundance  
233 of blood FCRL3 mRNA level could also decrease the MS risk (OR = 0.75,  $P = 1.03 \times 10^{-8}$ , PP.H4 = 97.9%,

234 Table S15). As the transcriptional level results aligned with the protein level, we considered the association  
235 between FCRL3 protein abundance and MS risk less likely to be confounded by aptamer-binding effects.

### 236 **Consistency of results within and across brain and blood**

237 All replication analyses of brain proteins using external replication datasets showed consistent results  
238 with the primary analysis. For drug targets identified through MR with blood proteins, AHSB for MS was  
239 not replicated, and RET for AD was only partially replicated (Table S16). Additionally, GPNMB for PD  
240 was replicated in a second brain region, the parietal lobe cortex (OR = 1.51,  $P = 1.80 \times 10^{-7}$ , PP.H4 =  
241 95.0%). Other replication analyses for different brain regions were not conducted due to the lack of  
242 eligible instrumental variables.

243 The correlation analysis showed robust within-tissue consistency. For MR estimates of all brain  
244 proteins, the correlation coefficients were 0.84 ( $P < 0.001$ ) and 0.95 ( $P < 0.001$ ) between the discovery  
245 dataset and two replication datasets (Figure S2). For MR estimates of all blood proteins, the correlation  
246 coefficients were 0.75 ( $P < 0.001$ ) and 0.72 ( $P < 0.001$ ). We also observed greater consistency of MR  
247 estimates across studies in proteins whose instruments were in higher LD (Figures S2-4). However, only a  
248 weak correction of MR estimates between brain and blood proteins was detected ( $r^2 = 0.16$ ,  $P = 0.002$ ),  
249 although the coefficient increased ( $r^2 = 0.50$ ,  $P = 0.002$ ) when the analysis was limited to proteins with at  
250 least nominal significance in MR analysis (Figure S4).

### 251 **Drug target prioritization and phenome-wide Mendelian randomization (phe-MR)**

252 Finally, we prioritized 16 brain-based and seven blood-based proteins as drug targets for  
253 neurodegenerative disorders, given the evidence of medium to high levels of causality. Remarkably, high  
254 GPNMB abundance in both brain and blood increased the risk of PD (Table 1). We selected 826  
255 phenotypes as potential side-effects from the MRC IEU OpenGWAS Project (28, 30) and performed  
256 phenome-wide MR in combination with colocalization analysis among the prioritized drug targets (Table  
257 S17). Encouragingly, targeting brain PSMB3, SARM1, DGKQ, and circulating BIN1, RET, MAPK3, and  
258 GPNMB protein levels to reduce disease risk did not exhibit any significant adverse side-effect, indicating  
259 the general safety of the hypothetical on-target interventions (Table S18). Besides, we found that 12 of 22  
260 prioritized proteins are druggable, and their related approved drugs or candidates in clinical development

261 are listed in Table S19 (31). The overall causality, safety, and druggability of each prioritized target are  
1  
2 262 illustrated in Figure 4.

## 3 4 5 263 **Discussion**

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7 264 In this study, we prioritized 22 proteins that had possible causal relationships with neurodegenerative  
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9 265 diseases and showed little bias due to confounding, pleiotropy, linkage, or reverse causation. We assessed  
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11 266 the target-disease linkage, as well as the safety and druggability of targets, which were key aspects  
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13 267 highlighted in the GOT-IT recommendations for drug development (33). Given the enormous cost of  
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15 268 measuring thousands of proteins before disease onset in studies with large samples, findings from our  
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17 269 integrative analysis would substantially promote the cost-optimization and efficiency in drug development  
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20 270 for neurodegenerative disorders.

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23 271 Our analysis prioritizes five proteins (*ACE*, *ICA1L*, *MAP1S*, *SLC20A2*, and *TOM1L2*) in brain and  
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25 272 three proteins (*BIN1*, *GRN*, and *RET*) in blood for AD. *ACE* is an established genetic locus contributing to  
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27 273 AD risk (14, 34). Our study further indicated that interventions to increase the abundance of protein *ACE*  
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29 274 in brain might decrease the AD risk yet elevate the blood pressure. This finding was supported by a recent  
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31 275 network meta-analysis that the *ACE* inhibitors showed significantly lower efficacy in reducing the risk of  
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33 276 dementia than other classes of antihypertensive drugs (35). *ICA1L*, *SLC20A2*, and *TOM1L2* were not  
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35 277 recommended as prioritized drugs due to their potential side-effects indicated by the phe-MR analysis. The  
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37 278 effect of brain *TOM1L2* on cognition might be dynamic, which needs to be validated in future studies with  
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39 279 patients in different stages across the AD continuum. Progranulin (encoded by *GRN*) is a promising target  
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41 280 for AD. Previous mouse models had demonstrated the reduced amyloid plaque burden, downregulated  
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43 281 beta-secretase 1, and enhanced amyloid phagocytosis of microglia after the intrahippocampal injection of  
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45 282 progranulin (36). However, psychiatric side-effects should be considered when targeting circulating  
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47 283 progranulin to prevent or treat AD. Medications targeting circulating *BIN1* and *RET* levels to reduce AD  
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49 284 risk may be generally safe, while the underlying mechanisms need to be further elucidated in the future.

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53 285 *GPNMB* is an attractive drug target for PD, given that the increased protein levels in both blood and  
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55 286 brain were associated with the higher lifetime PD risk in our analysis. Targeting *GPNMB* would be  
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57 287 technically feasible due to its druggability, and the medications would be generally safe according to the  
58  
59 288 phe-MR analysis. A recent paper showed that plasma *GPNMB* levels were elevated in PD patients and

289 associated with the disease severity (37). In a post-mortem study, GPNMB protein levels were elevated in  
1 the substantia nigra in PD patients compared to healthy controls (38). Cell models also indicated that  
2 290 GPNMB might confer PD risk through the interaction with a-synuclein (37). The mechanisms and clinical  
3 utility of other protein targets (CD38, DGKQ, and SEC23IP) for PD warrant further exploration by  
4 291 experimental studies.  
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11 294 We also prioritized seven targets (DHRS11, FAM120B, FCRL3, LMAN2, MAPK3, SHMT1, and  
12 TSFM) for MS and four targets (DHRS11, PSMB3, SARM1, and SCFD1) for ALS. The safety of these  
13 295 targets is generally acceptable, though there is still a lack of investigations at the protein level by  
14 observational and experimental studies. An observational study at the transcriptional level revealed  
15 296 downregulated *FCRL3* expression in blood samples of MS patients compared to healthy controls,  
16 consistent with our findings (39). It was suggested that *FCRL3* might inhibit the secretion of inflammatory  
17 297 factors by promoting IL-10 expression in B cells (39). Surprisingly, protein DHRS11 was identified as a  
18 drug target for both ALS and MS. As DHRS11 is involved in steroid biosynthesis and most MS cases are  
19 298 steroid responsive (40, 41), our findings could provide novel insights into the therapeutic strategy for ALS.  
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31 303 Compared with previous integrative studies (9, 42, 43), our study highlights the comparison of results  
32 between different tissues at the protein level. The consistent results derived from brain and blood data  
33 304 would support the effectiveness of targeting peripheral proteins to prevent or treat brain disorders through  
34 non-invasive or minimally invasive approaches. Nonetheless, only one protein–disease linkage (GPNMB-  
35 305 PD) was identified in both tissues in the current study, largely because of the lack of proteins with eligible  
36 genetic instruments in both brain and blood. This issue could be addressed with the increased sample size  
37 306 of proteomic studies in the future. Meanwhile, we only observed a significant but weak correlation of MR  
38 estimates between brain and blood, indicating that findings from one tissue should not be directly  
39 307 generalized to other tissues. The weak correlation could be explained by the existence of the blood-brain  
40 barrier as well as the different protein expression patterns between the brain and blood. Other advantages  
41 308 of this study include the standardized workflow for screening candidate causal targets, as well as the  
42 assessment of safety and druggability, which would help promote the development of efficient drugs.  
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57 315 Several limitations should be addressed in this study. First, although MR has competitive advantages  
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1 317 causation. Second, since GWAS used in this study were based on lifetime risks of neurodegenerative  
2 318 diseases at the group level, the translation to risk prediction, prevention, and prognosis monitoring at the  
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4 319 individual level still needs more investigation. Third, our analytical pipeline was not able to identify every  
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6 320 protein implicated in neurodegenerative disorders. As we had set stringent quality control criteria to  
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8 321 improve the reliability of identified targets, proteins without eligible instruments were not included in the  
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10 322 final analysis. Fourth, MR results derived from a single instrumental variable should be taken with caution,  
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12 323 especially for those whose sensitivity and replication analyses were not able to perform. Fifth, our analyses  
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14 324 were based on European samples, so the generalization to non-European ancestries needs to be validated in  
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16 325 the future.  
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20 326 In conclusion, this study prioritized 22 proteins whose abundance in brain or blood was associated  
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22 327 with lifetime risks of neurodegenerative diseases. Some proteins, such as GPNMB, not only demonstrated  
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24 328 a causal linkage to neurodegenerative diseases but also showed robust on-target safety and technical  
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26 329 feasibility, representing promising targets for current drug discovery. Future experimental studies are  
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28 330 warranted to assess the effectiveness and safety of the identified targets and decipher their underlying  
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30 331 biological mechanisms.  
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3 334 GWAS summary statistics of QTLs and neurodegenerative diseases are available from the peer-  
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5 335 reviewed articles or the corresponding authors upon request. Other phenotypes of potential side-effects are  
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7 336 available from MRC IEU OpenGWAS Project (<https://gwas.mrcieu.ac.uk/>) and the MR-Base  
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9 337 (<https://www.mrbase.org/>) platform. The PhenoScanner database is available online  
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499 **Figure legends**

500 **Figure 1. Flow diagram of the study design.**

501 First, selected independent *cis*-pQTLs from comprehensive pQTL datasets as genetic instruments and  
502 filtered the instruments via consistency and specificity tests. Next, we screened the human brain and blood  
503 proteomes through MR to identify candidate drug targets. Third, by applying multiple MR approaches, the  
504 causal relationships between the identified targets and diseases were further validated. Fourth, we  
505 investigated whether the protein and the disease share a common causal variant via Bayesian  
506 colocalization. Fifth, replication and correlation analyses were conducted to estimate the consistency of  
507 results within and across brain and blood. Sixth, we summarized the evidence of causality and expanded  
508 our analysis pipeline to the phenome-wide to evaluate the safety of targets by predicting side-effects.  
509 Finally, the druggability of the prioritized protein targets was checked.

511 **Figure 2. Manhattan plots for the primary MR analysis of the brain and blood proteomes.**

512 By screening the human brain and blood proteomes, 19 protein-disease associations in brain (**A**) and 17  
513 protein-disease associations in blood (**B**) were identified. Each point represents a single MR test ordered  
514 by chromosomal position of the sentinel *cis*-pQTL on the *X* axis and  $-\log_{10} P$  value on the *Y* axis. The red  
515 dotted lines represent the Bonferroni multiple testing thresholds (0.05/608 for brain and 0.05/611 for  
516 blood). Proteins that survived the Bonferroni threshold are colored by their associated diseases.

518 **Figure 3. Heatmap for the causal relationship assessment of the identified drug targets.**

519 The causal relationships of identified drug targets from brain (**A**) and blood (**B**) with neurodegenerative  
520 diseases were further validated by the replication and multi-*cis* analyses, the heterogeneity, pleiotropy, and  
521 directional tests, as well as sensitivity analysis regarding aptamer-binding effects. The depths of blue and  
522 orange represent the size of *P* values in MR analyses, and the depth of green denotes the posterior  
523 probability of colocalization. Targets with consistent evidence in all analyses were rated as a high level of  
524 causality, while targets with conflict evidence in either replication or multi-*cis* analysis, evidence of

525 aptamer-binding effects, or not likely to colocalize were rated as a low level of causality and thus were not  
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2 526 considered as credible targets.

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7 528 **Figure 4. Overall assessment of drug targets for neurodegenerative diseases.**

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10 529 This figure illustrates three critical assessment aspects of drug targets: causality (*X*-axis), safety (*Y*-axis),  
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12 530 and druggability (in bold). Incredible targets are not depicted in this figure. The evidence of causality was  
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14 531 rated according to six analyses and each contributes one point: 1) consistent in multi-*cis* MR 2) no  
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16 532 evidence of heterogeneity 3) no evidence of pleiotropy 4) true causal direction 5) replicated in other  
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18 533 datasets, and 6) highly likely to colocalize. The evidence of safety was approximated by the sum PP.H4 of  
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20 534 all adverse effects passed the Bonferroni correction. A target was rated druggable if identified in any  
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22 535 druggable tier according to Finan's criteria or had any related drug in the DrugBank database. Diamonds  
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24 536 refer to brain-based proteins and discs represent blood-based proteins. Proteins are colored according to  
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26 537 their associated diseases. Notably, the genetic association between protein GPNMB and PD risk was  
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28 538 identified in both brain and blood tissues.

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**Table 1. Prioritized drug targets for neurodegenerative diseases.**

Disease	Protein	OR (95% CI)	P value	PP.H4	Druggability <sup>a</sup>	On-target adverse side-effects identified by phe-MR analysis <sup>b</sup>
<b>Brain proteome</b>						
AD	ACE	0.55 (0.41-0.74)	5.76E-05	96.7%	Tier 1 (A/V/I/E)	SBP↑, DBP↑
	ICAI1L	0.38 (0.24-0.59)	1.57E-05	98.1%	NA	CAD↑, MI↑, DBP↓
	MAP1S	2.36 (1.58-3.55)	3.17E-05	95.7%	NA	CAD↑, MI↑, lean mass↓
	SLC20A2	0.45 (0.31-0.66)	4.17E-05	93.2%	NA (A)	Hemoglobin↓, lean mass↓
	TOM1L2	3.85 (2.09-7.11)	1.53E-05	88.8%	NA	CP↓, WP↓, MI↑, prostate cancer↑
ALS	DHRS11	0.58 (0.45-0.74)	2.16E-05	56.6%	NA (E)	MS↑
	PSMB3	2.24 (1.51-3.33)	5.76E-05	97.0%	Tier 3 (E)	None
	SARM1	0.31 (0.20-0.48)	8.27E-08	100.0%	NA	None
	SCFD1	5.42 (3.53-8.32)	1.02E-14	98.3%	NA	Lung function↓
MS	DHRS11	2.22 (1.52-3.22)	3.02E-05	71.5%	NA (E)	ALS↑
	FAM120B	4.40 (2.15-9.03)	5.10E-05	95.8%	NA	SBP↓, DBP↓
	SHMT1	1.94 (1.44-2.61)	1.20E-05	98.0%	NA (A/V/N/I/E)	Triglycerides↑, HDL cholesterol↓
	TSFM	4.87 (3.00-7.89)	1.38E-10	96.0%	NA	25(OH)D↓, hemoglobin↓
PD	CD38	0.32 (0.24-0.42)	6.99E-14	100.0%	Tier 1 (A/I)	Lung function↓
	DGKQ	0.14 (0.07-0.26)	1.97E-09	87.9%	NA (A/V/N)	None
	GPNMB	1.46 (1.28-1.67)	2.48E-08	98.4%	Tier 1 (I)	Grip strength↓
	SEC23IP	7.88 (3.02-20.56)	2.45E-05	98.5%	NA	SBP↑
<b>Blood proteome</b>						
AD	BIN1	1.87 (1.66-2.12)	1.46E-23	69.6%	NA	None
	GRN	0.83 (0.77-0.90)	2.99E-06	99.5%	Tier 3	Worry↑, mood swings↑,
	RET	1.18 (1.09-1.28)	7.87E-05	74.7%	Tier 1 (A/I/E)	None
MS	FCRL3	0.83 (0.79-0.89)	8.93E-09	94.1%	Tier 3	Hypothyroidism↑
	LMAN2	1.56 (1.25-1.95)	7.19E-05	83.4%	NA	Sleep duration↓, red blood cell↓
	MAPK3	0.56 (0.44-0.72)	4.94E-06	71.4%	Tier 1 (A/I/E)	None
PD	GPNMB	1.51 (1.30-1.77)	1.80E-07	55.6%	Tier 1 (I)	None

<sup>a</sup>The druggability was checked according to Finan's criteria (druggable tiers) and the DrugBank database (drug relations). Briefly, tier 1 included targets with approved drugs or drugs in clinical trials. Tier 2 contained targets with drug-like binding partners or those in high identity with approved drug targets. Tier 3 was composed of targets encoding extracellular proteins and members of major drug target families. Approved drugs (A) are officially accepted for commercialization, while vet-approved drugs (V) are only accepted to be used in animals. Nutraceuticals (N) have demonstrable nutritional effects and are regulated and processed at a pharmaceutical grade. Investigational drugs (I) have entered clinical trials and are being researched for a determinate condition. Experimental drugs (E) are experimentally proven but have not reached clinical trials. <sup>b</sup>On-target adverse side-effects that survive the correction for multiple testing ( $P < 0.05/824$ ) with evidence of colocalization ( $PP.H4 \geq 50\%$ ) are displayed here. Abbreviations: ALS, amyotrophic lateral sclerosis; CAD, coronary artery disease; CP, cognitive performance; DBP, diastolic blood pressure; HDL, high-density lipoprotein; MI, myocardial infarction; MS, multiple sclerosis; NA, not available; phe-MR, phenome-wide Mendelian randomization; PP.H4, posterior probability of colocalization; SBP, systolic blood pressure; WP, walking pace.

Figure 1

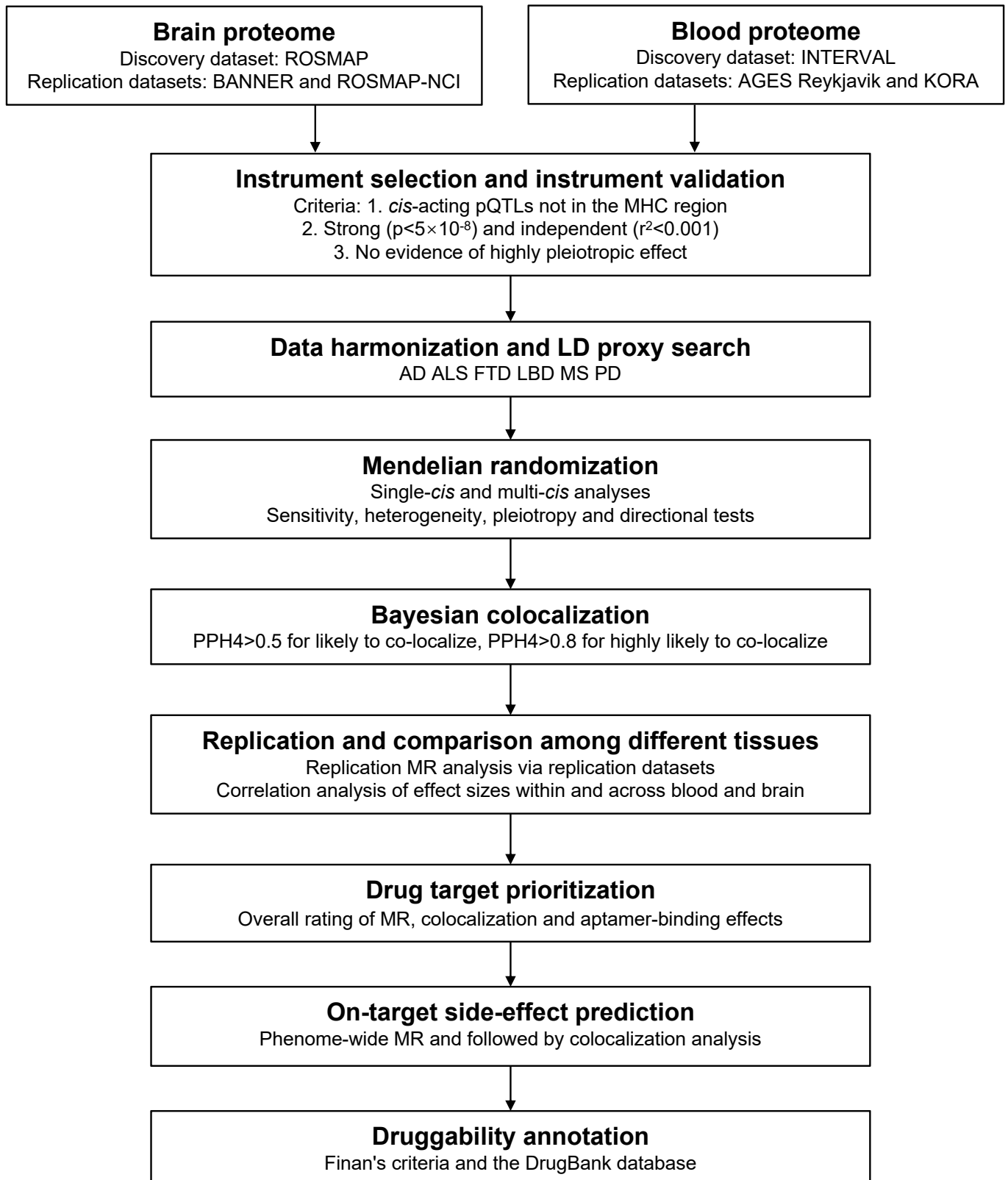
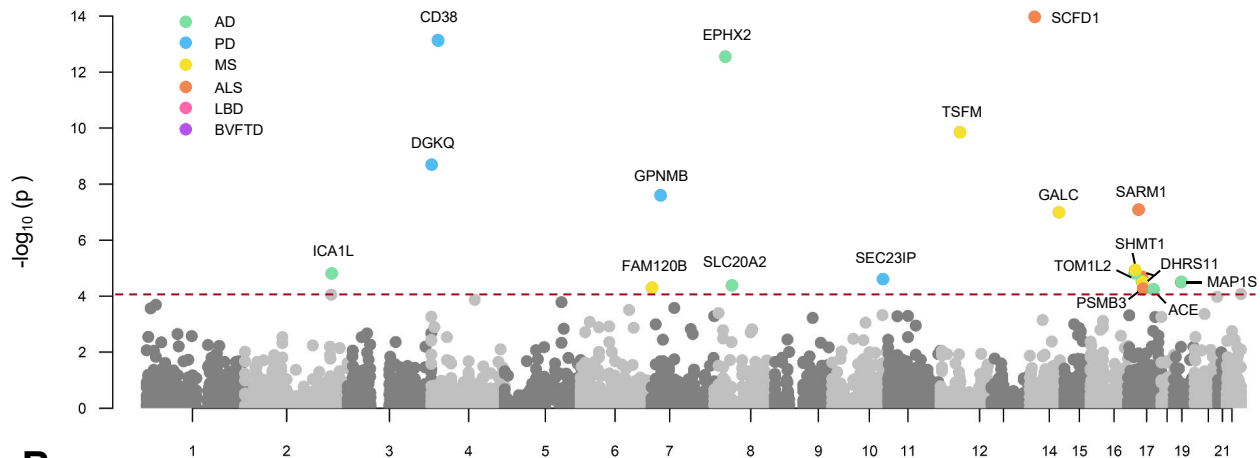


Figure 2

**A**



**B**

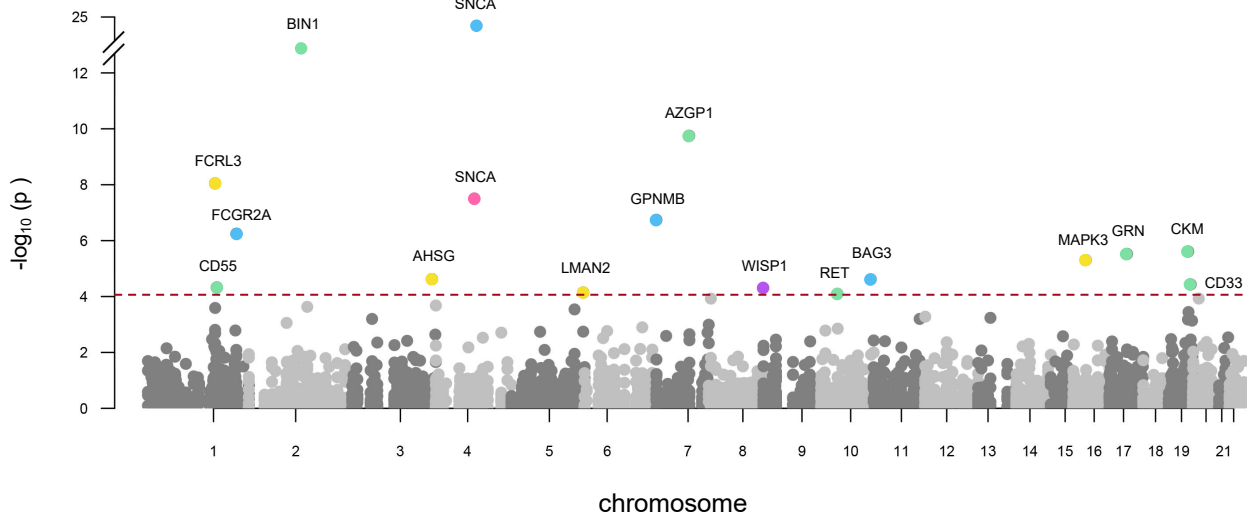




Figure 3

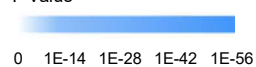
**A**

Disease	Protein	Discovery	Replication	Multi- <i>cis</i>	Heterogeneity	Pleiotropy	Colocalization	Rating
AD	ACE	5.8E-05	1.5E-07	5.3E-11	3.9E-01		96.7%	Medium
	EPHX2	2.7E-13	2.7E-13	9.7E-05	8.3E-06	9.0E-01	0.0%	Low
	ICA1L	1.6E-05					98.1%	Medium
	MAP1S	3.2E-05	3.2E-05	3.5E-08	9.9E-01		95.7%	Medium
	SLC20A2	4.2E-05					93.2%	Medium
	TOM1L2	1.5E-05	3.2E-05	1.2E-08	9.0E-01		88.8%	Medium
ALS	DHRS11	2.2E-05	2.0E-02	3.5E-05	4.2E-02	8.8E-01	56.6%	Medium
	PSMB3	5.8E-05					97.0%	Medium
	SARM1	8.3E-08	2.5E-06	1.7E-10	5.2E-01		100.0%	Medium
	SCFD1	1.0E-14		2.6E-34	9.7E-01	9.7E-01	98.3%	Medium
MS	DHRS11	3.0E-05	3.1E-05	9.6E-09	2.2E-01	9.1E-01	71.5%	Medium
	FAM120B	5.1E-05		5.1E-05			95.8%	Medium
	GALC	1.0E-07	1.1E-07	3.5E-04	3.7E-05	5.6E-01	4.7%	Low
	SHMT1	1.2E-05	1.2E-05	3.1E-06	7.6E-02	8.3E-01	98.0%	High
	TFSM	1.4E-10	6.4E-11	2.9E-24	7.0E-01	5.8E-01	96.0%	High
PD	CD38	7.0E-14	3.5E-04	2.0E-21	4.5E-01		100.0%	Medium
	DGKQ	2.0E-09					87.9%	Medium
	GPNMB	2.5E-08	1.2E-08	5.9E-14	4.9E-01		98.4%	Medium
	SEC23IP	2.5E-05	1.8E-05				98.5%	Medium

**B**

AD	AZGP1	1.8E-10					0.1%	Low
	BIN1	1.5E-23		5.2E-38	3.4E-01		69.6%	Medium
	CD33	3.7E-05	4.9E-06	7.2E-14	1.6E-05	5.5E-04	99.8%	Low
	CD55	5.6E-07	2.6E-05	1.7E-17	4.5E-16	4.6E-01	0.0%	Low
	CKM	2.5E-06	2.0E-07				0.0%	Low
	GRN	3.0E-06		2.7E-12	8.5E-01	5.8E-01	99.5%	Medium
	RET	7.9E-05	9.8E-05	8.8E-08	7.3E-02	5.5E-01	74.7%	Medium
BVFTD	WISP1	4.8E-05	1.5E-02	2.7E-14	6.8E-01	1.1E-01	33.3%	Low
LBD	SNCA	3.1E-08	1.0E-07	3.1E-14	8.5E-01	9.9E-01	17.2%	Low
MS	AHSG	2.4E-05	3.6E-01	5.7E-07	6.9E-03	8.0E-01	96.4%	Low
	FCRL3	8.9E-09	5.2E-08	6.5E-32	1.4E-04	9.8E-01	94.1%	Medium
	LMAN2	7.2E-05		1.2E-09	5.2E-01		83.4%	Medium
	MAPK3	4.9E-06					71.4%	Medium
PD	BAG3	2.4E-05					1.1%	Low
	FCGR2A	4.7E-05	2.5E-04	2.1E-22	1.6E-02	8.2E-01	92.4%	Low
	GPNMB	1.8E-07	2.2E-07	1.3E-25	7.3E-01	4.9E-01	55.6%	Medium
	SNCA	6.3E-25	5.9E-29	9.7E-53	9.1E-01	8.0E-01	0.0%	Low

P value



P value



PP.H4

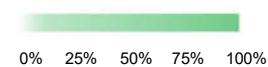
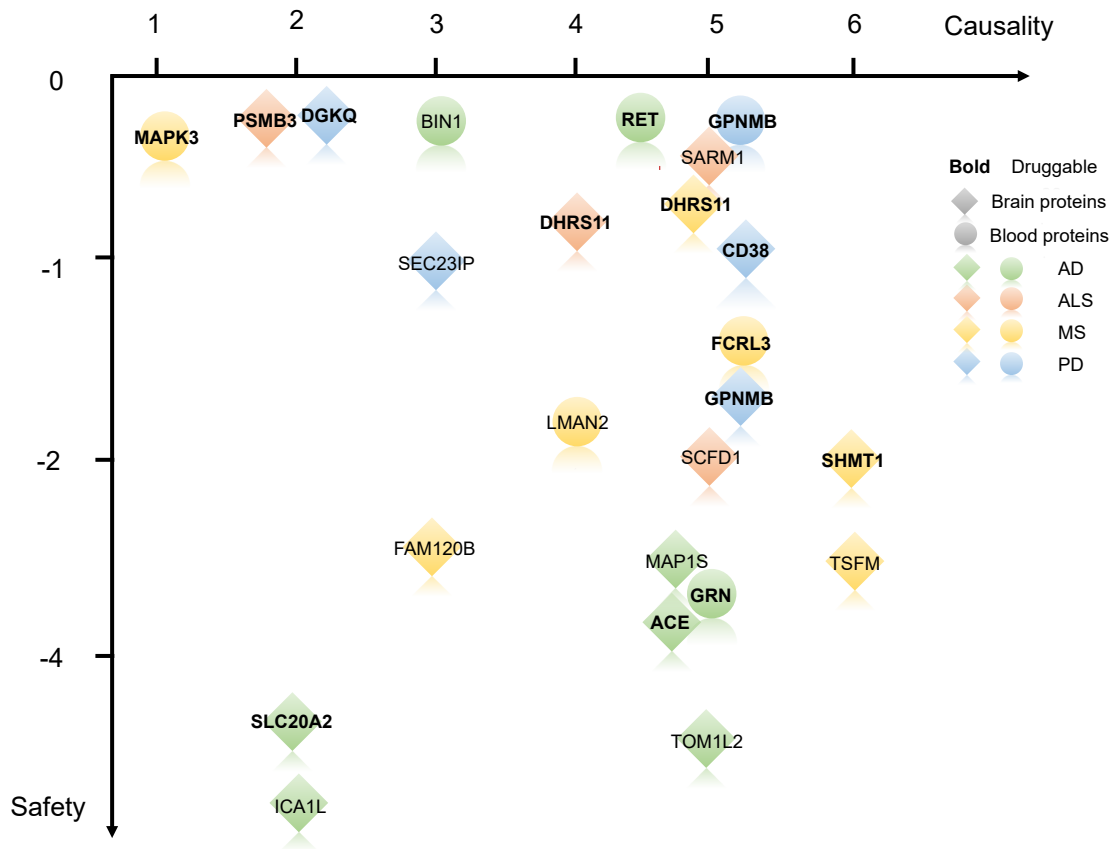


Figure 4



## SUPPLEMENTARY INFORMATION

### Prioritization of Drug Targets for Neurodegenerative Diseases by Integrating Genetic and Proteomic Data From Brain and Blood

*Ge et al.*

#### Content

<b>Supplementary Methods</b> .....	2
<b>Figure S1.</b> MR assumptions and possible explanations for the observed associations between pQTL and neurodegenerative diseases .....	5
<b>Figure S2.</b> Correlation analysis of MR estimates within brain proteomes.....	7
<b>Figure S3.</b> Correlation analysis of MR estimates within blood proteomes.....	8
<b>Figure S4.</b> Correlation analysis of MR estimates between brain and blood.....	9
<b>Supplementary Acknowledgments</b> .....	10

## **Supplementary Methods**

### **Human brain and blood-derived pQTL data**

The discovery brain pQTL data were generated from post-mortem samples of the dorsolateral prefrontal cortex (dPFC) donated by 376 individuals in ROS/MAP (1). The proteomic profiles included 8,356 proteins labeled by isobaric tandem mass tag (TMT) peptide and analyzed by liquid chromatography coupled to mass spectrometry (LC-MS) (2, 3). As the full discovery dataset included cognitively impaired participants, we used the same dataset restricted to 144 cognitively normal individuals for replication (4). Another brain pQTL data derived from 149 donors from the Banner Sun Health Research Institute were used for cross-study replication (5). The proteomic data in the Banner study were profiled using similar approaches to ROS/MAP (4). Besides, the Washington University cohort has identified brain pQTLs in the parietal lobe cortex recently, and the pQTL data were used for the replication analysis of different brain regions in this study (6).

The discovery blood pQTL data originated from the INTERVAL study, which was nested in an RCT of varying blood donation intervals and comprised around 50,000 generally healthy participants (7). The proteomic profiles of the INTERVAL study were generated from 3,301 blood donors and included 3,622 plasma proteins measured by SOMAscan. We leveraged pQTL data from two independent SOMAmer-based blood proteomic datasets (AGES Reykjavik,  $n = 3,200$  and KORA,  $n = 997$ ) for cross-study replication (8, 9). The INTERVAL study was utilized for the primary analysis owing to its large sample size and availability of the complete summary data. Additionally, blood expression quantitative trait loci (eQTLs) from the Genotype-Tissue Expression (GTEx) project were used for target validation considering the aptamer-binding effects (10). Further details of all QTL studies are listed in Table S1.

### **Principal assumptions of MR**

The MR approach builds upon principal assumptions (Figure S1). The three fundamental assumptions of MR analysis are: 1) the instruments must be truly associated with the exposure, 2) the instruments should not be associated with confounders, and 3) the instruments affect the outcome only through the exposure (11). To satisfy assumption 1, we selected instruments only strongly ( $P < 5 \times 10^{-8}$ ) associated with the protein abundance and later conducted a sensitivity analysis considering the aptamer-binding effect. For assumption 2, we checked the instrument specificity and excluded all variants (and their proxies) associated with more than five proteins

before performing MR analysis. Additionally, we only selected cis-acting pQTLs for analysis to reduce the horizontal pleiotropy (violation of assumption 3) and further tested the existence of horizontal pleiotropy by Egger intercept. Although the second and third assumptions could not be fully validated in MR practice, our endeavors would minimize the bias due to violations of the above assumptions.

### **Hypotheses of Bayesian colocalization**

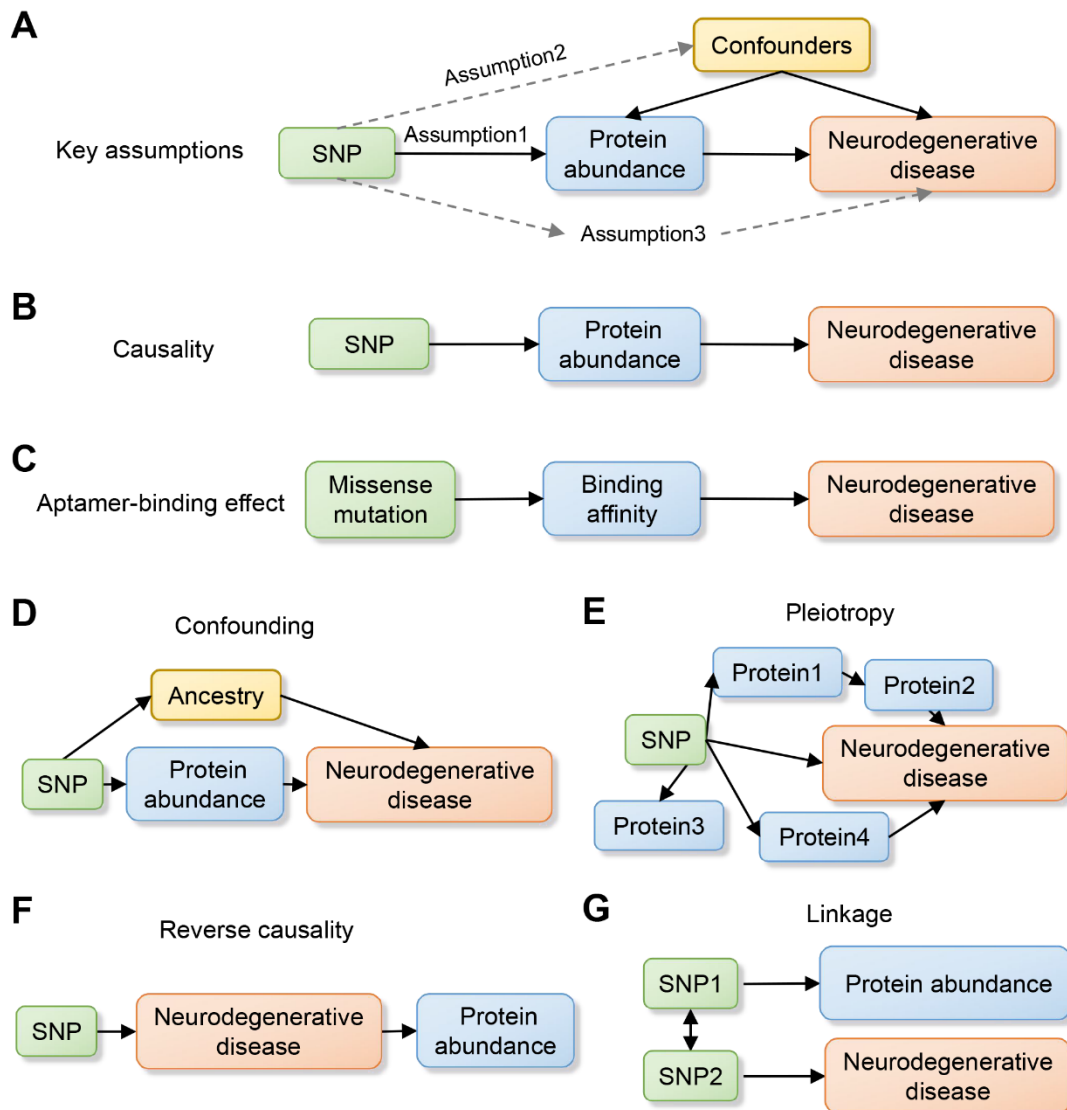
Bayesian colocalization was performed to strengthen the evidence of causality by calculating the posterior probability (PP) that the protein and disease share the same causal signal (H4). It is opposed to other hypotheses: 1) no causal signal (H0), 2) only one causal signal for either the protein or the disease (H1/H2), and 3) two distinct causal signals were identified in the region (H3). A posterior probability for H4 (PP.H4) of at least 50% (i.e., the highest among all five hypotheses) suggests likely to colocalize, and a PP.H4 of at least 80% suggests highly likely to colocalize (12).

### **References for Supplementary Methods**

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**Figure S1. MR assumptions and possible explanations for the observed associations between pQTL and neurodegenerative diseases**

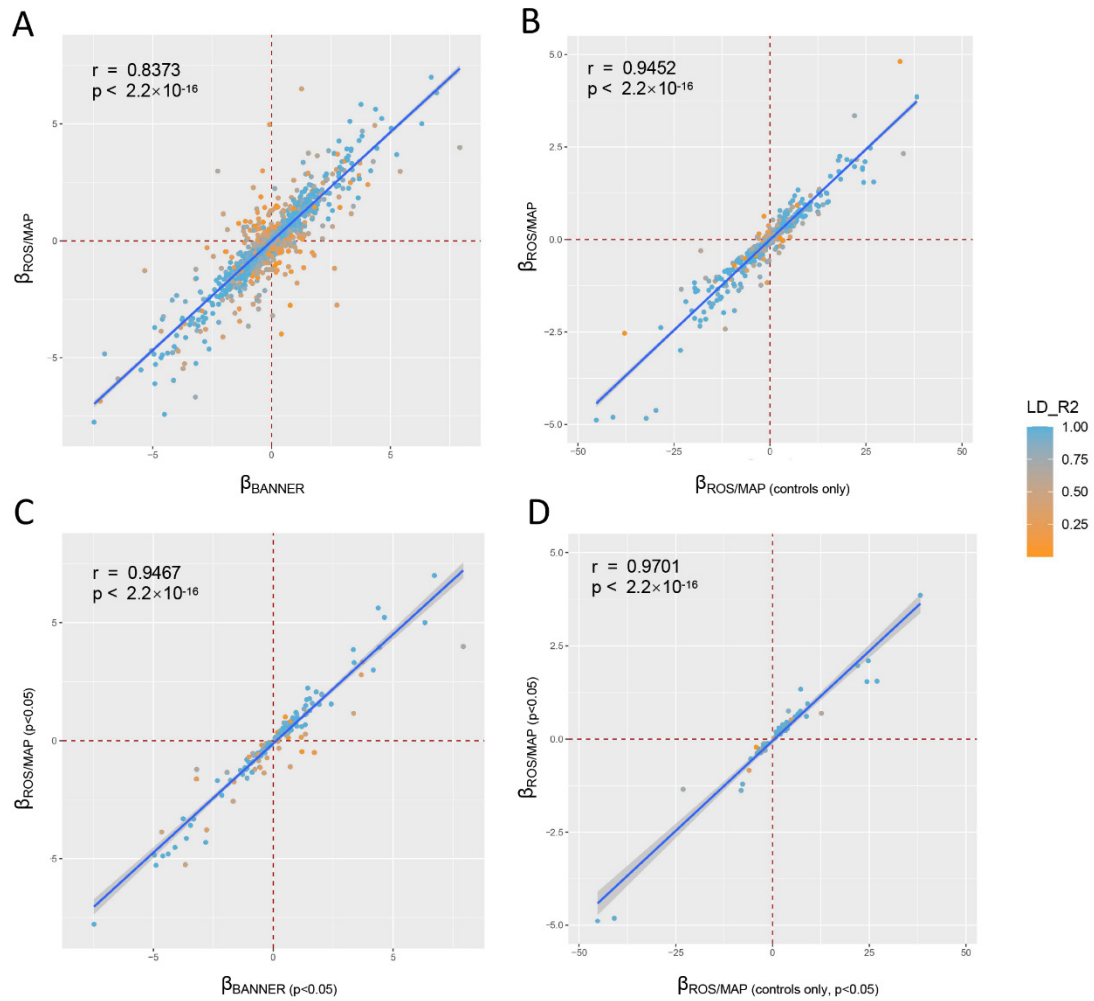


The three basic assumptions of MR analysis are: 1) the instruments must be truly associated with the exposure, 2) the instruments should not be associated with confounders, and 3) the instruments affect the outcome only through the exposure (**A**). If the risk of a neurodegenerative disease is affected by the abundance of a protein only through the instrument, it is known as causality (**B**). Aptamer-binding effects indicate that the protein-altering variants (PAVs) in aptamer-based proteomic studies may yield artifactual pQTLs by influencing the molecular structure of the protein and then the binding affinity instead of the protein abundance. In this case, the causal association identified by MR analysis based on the PAVs might be attributed to different protein isoforms but not the protein abundance (**C**). Violation of assumption 2 often occurs when there are confounders

(e.g., ancestry) of the associations between instruments and outcome **(D)**. Instruments associated with large amounts of proteins are more likely to affect the disease risk through indirect pathways, which was a manifestation of horizontal pleiotropy **(E)**. Reverse causality may occur when the instrument has a stronger association with the outcome than the exposure **(F)**. In some cases, SNP associated with the protein is in linkage disequilibrium with another SNP that independently influences the neurodegenerative disease **(G)**.

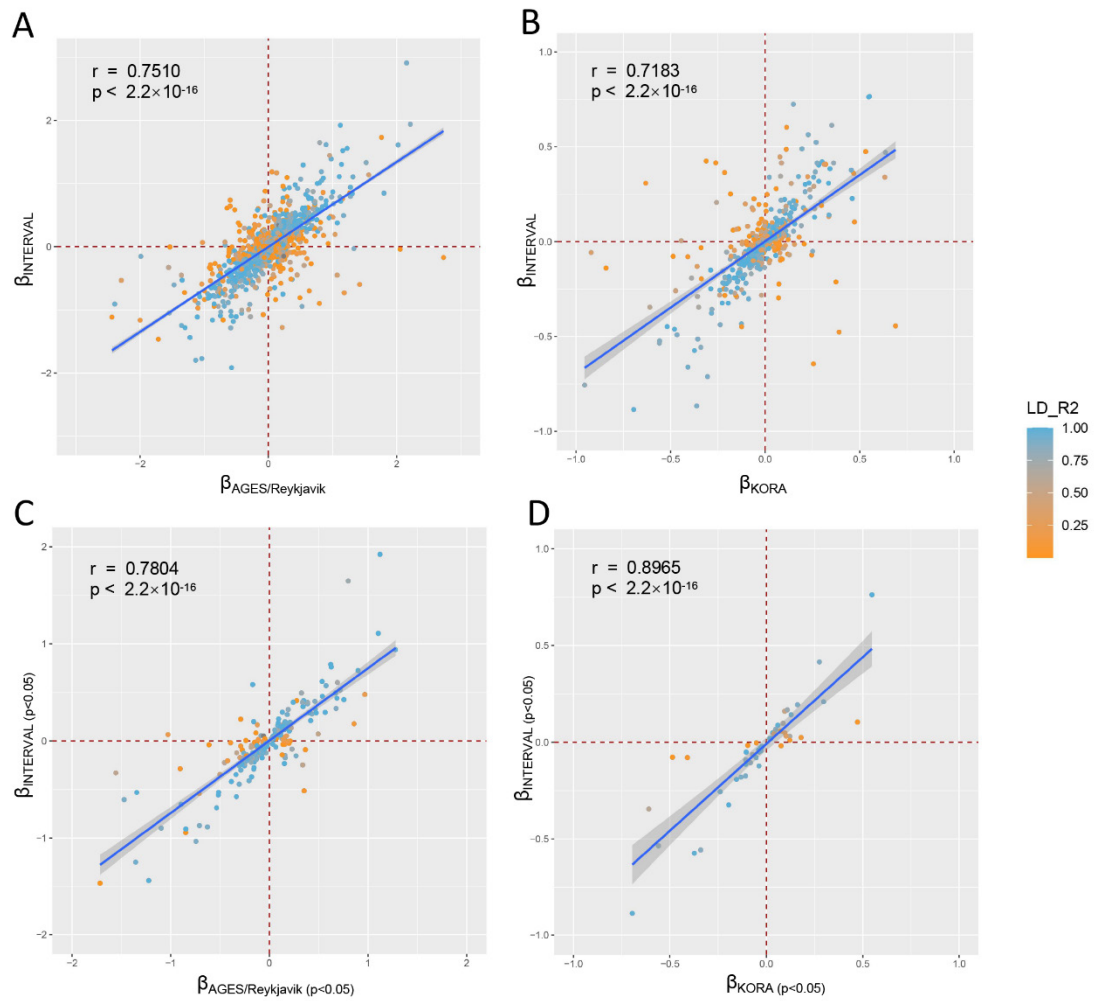


**Figure S2. Correlation analysis of MR estimates within brain proteomes**



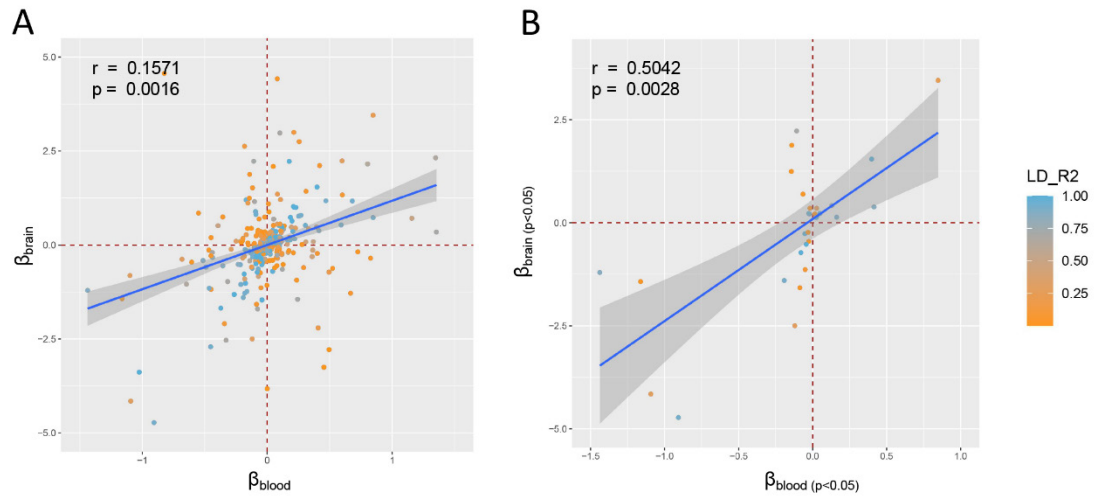
The correlation analyses of MR estimates indicated remarkable consistency within brain pQTL datasets. The correlation coefficient was 0.84 ( $P < 0.001$ ) between ROS/MAP and BANNER (A), and 0.95 ( $P < 0.001$ ) between the discovery dataset and same the dataset limited in the normal cognition (B). Restricting the analyses to proteins with at least nominal significance yielded similar correlation coefficients (C and D). Proteins with instruments in higher LD showed greater consistency of MR estimates across studies.

**Figure S3. Correlation analysis of MR estimates within blood proteomes**



Strong consistency was also identified in the correlation analyses of MR estimates within blood pQTL datasets. The correlation coefficient was 0.75 ( $P < 0.001$ ) and 0.72 ( $P < 0.001$ ) between INTERVAL and two replication datasets (A and B). Restricting the analyses to proteins with at least nominal significance would lead to stronger correlations (C and D). Proteins with instruments in higher LD showed greater consistency of MR estimates across studies.

**Figure S4. Correlation analysis of MR estimates between brain and blood**



Only a weak correlation of MR estimates between brain and blood proteins was detected (correlation coefficient=0.16,  $P=0.002$ ) (A), although the coefficient increased (correlation coefficient=0.50,  $P=0.002$ ) when the correlation analysis was limited in proteins with at least nominal significance in MR analysis (B). Instruments of brain and blood proteins were generally in low LD.

## **Supplementary Acknowledgements**

### **The Religious Orders Study and Memory and Aging Project (ROSMAP) Study**

The results published here are in whole or in part based on data obtained from the AD Knowledge Portal (<https://adknowledgeportal.org>). Study data were provided through the Accelerating Medicine Partnership for AD (U01AG046161 and U01AG061357) based on samples provided by the Rush Alzheimer's Disease Center, Rush University Medical Center, Chicago. Data collection was supported through funding by NIA grants P30AG10161, R01AG15819, R01AG17917, R01AG30146, R01AG36836, U01AG32984, U01AG46152, the Illinois Department of Public Health, and the Translational Genomics Research Institute.

### **The Banner Sun Health Research Institute (Banner) Study**

The results published here are in whole or in part based on data obtained from the AD Knowledge Portal (<https://adknowledgeportal.org/>). These data were provided by Dr. Levey from Emory University. A portion of these data were generated from samples collected through the Sun Health Research Institute Brain and Body Donation Program of Sun City, Arizona. The Brain and Body Donation Program is supported by the National Institute of Neurological Disorders and Stroke (U24 NS072026 National Brain and Tissue Resource for Parkinson's Disease and Related Disorders), the National Institute on Aging (P30 AG19610 Arizona Alzheimer's Disease Core Center), the Arizona Department of Health Services (contract 211002, Arizona Alzheimer's Research Center), the Arizona Biomedical Research Commission (contracts 4001, 0011, 05-901 and 1001 to the Arizona Parkinson's Disease Consortium) and the Michael J. Fox Foundation for Parkinson's Research.

### **The Washington University cohort**

We thank the authors for sharing summary data. The summary statistics (pQTL) data are available by emailing [niagads@penntmedicine.upenn.edu](mailto:niagads@penntmedicine.upenn.edu). Individual-level data are accessible through formal data request. Both summary statistics and individual-level data have been uploaded to the National Institute on Aging Genetics of Alzheimer's Disease Data Storage Site repository at <https://www.niagads.org/datasets/ng00102> for multiple tissues from the Knight ADRC dataset for discovery. This work was supported by grants from the National Institutes of Health (NIH) (R01AG044546 (C.C.), P01AG003991 (C.C. and J.C.M.), RF1AG053303 (C.C.), RF1AG058501

(C.C.), U01AG058922 (C.C.), R01NS118146 (B.A.B.) and R01AG057777 (O.H.)) and the Alzheimer Association (NIRG-11-200110 (C.C.), BAND14-338165 (C.C.), AARG-16-441560 (C.C.) and BFG-15-362540 (C.C.)). This work was supported by access to equipment made possible by the Hope Center for Neurological Disorders and the Departments of Neurology and Psychiatry at Washington University School of Medicine. The recruitment and clinical characterization of research participants at Washington University were supported by NIH P50AG05681 (J.C.M.), P01AG03991 (J.C.M.) and P01AG026276 (J.C.M.).

### **The INTERVAL study**

Participant-level genotype and protein data, and full summary association results from the genetic analysis, are available through the European Genotype Archive (accession number EGAS00001002555). Summary association results are also publicly available at <http://www.phpc.cam.ac.uk/ceu/proteins/>, through PhenoScanner (<http://www.phenoscaner.medschl.cam.ac.uk>) and from the NHGRI-EBI GWAS Catalog (<https://www.ebi.ac.uk/gwas/downloads/summary-statistics>). We thank INTERVAL study participants; staff at recruiting NHSBT blood donation centres; and the INTERVAL Study Co-ordination team, Operations Team (led by R. Houghton and C. Moore) and Data Management Team (led by M. Walker). This research was supported as follows. The Cardiovascular Epidemiology Unit at the University of Cambridge: UK MRC (G0800270), BHF (SP/09/002), UK NIHR Cambridge Biomedical Research Centre, ERC (268834), and European Commission Framework Programme 7 (HEALTH-F2-2012-279233); B.B.S.: Cambridge School of Clinical Medicine MB-PhD programme and MRC/Sackler Prize PhD Studentship (MR/K50127X/1); J.E.P.: a BHF Cambridge Centre of Excellence Research Fellowship [RE/13/6/30180] and a UK Research Innovation Fellowship (MR/S004068/1). P.S.: a Rutherford Fund Fellowship (MR/S003746/1); D.S.P. and D.S.: the Wellcome Trust (105602/Z/14/Z); N.S.: the Wellcome Trust (WT098051 and WT091310), the EU FP7 (EPIGENESYS 257082 and BLUEPRINT HEALTH-F5-2011-282510); J.A.T: the Wellcome Trust (091157) and JDRF (9-2011-253); K.S.: the Biomedical Research Program at Weill Cornell Medicine in Qatar via the Qatar Foundation; J.D.: BHF Professor, European Research Council Senior Investigator, and NIHR Senior Investigator; the INTERVAL study: NHSBT (11-01-GEN) and the NIHR-BTRU in Donor Health and Genomics (NIHR BTRU-

2014-10024) at the University of Cambridge in partnership with NHSBT. Data analysis was partly supported by the Cambridge Substantive Site of Health Data Research UK. This study was partially funded by Merck Sharp & Dohme Corp. The views expressed are those of the authors and not necessarily those of the NHS, the NIHR, the Department of Health of England, or NHSBT.

### **The AGES Reykjavik study**

Sentinel blood pQTL data are available in the supplementary materials of the pQTL study (doi: 10.1126/science.aaq1327). Data from the AGES Reykjavik study are available through collaboration (AGES\_data\_request@hjarta.is) under a data usage agreement with the IHA. We thank the staff at SomaLogic (CO) for performing the assays to measure protein levels, and P. MacNamara and G. Joyce of the Genomics Institute of the Novartis Research Foundation (GNF) for their leadership in supporting this work. We thank J. Loureiro, V. Swaroop, S. Abubucker, and F. Mapa of NIBR Cambridge for their contributions in support of the mass spectrometry workflow. We thank K. Bjarnadóttir, S. Gunnarsdóttir, and A. Hauksdóttir at the Icelandic Heart Association (IHA) for all specimen handling. The work was supported by Novartis Institute for Biomedical Research (NIBR), IHA, and in part by the intramural research program at the National Institute of Aging (N01-AG-12100 and HHSN271201200022C), the Althingi (the Icelandic Parliament), and the Icelandic Centre for Research (RANNIS) grant 141101-051.

### **The Cooperative Health Research in the Region of Augsburg (KORA) study**

Blood pQTL data are available in the supplementary materials of the pQTL study (doi: 10.1038/ncomms14357) and accessible online on an integrated web-server at <http://proteomics.gwas.eu>. Data for KORA are available upon request from KORA-gen (<http://epi.helmholtz-muenchen.de/kora-gen>). Requests are submitted online and are subject to approval by the KORA board. This work was supported by ‘Biomedical Research Program’ funds at Weill Cornell Medicine in Qatar, a program funded by the Qatar Foundation. The statements made herein are solely the responsibility of the authors. M. Arnold was supported by the Helmholtz cross-program topic ‘Metabolic Dysfunction’. D. Mook-Kanamori was supported by Dutch Science Organization (ZonMW-VENI Grant 916.14.023). The KORA study was initiated and financed by the Helmholtz Zentrum München—German Research Center for Environmental Health, which is

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### **The Genotype-Tissue Expression (GTEx) project**

GTEx can be accessed at <https://gtexportal.org/home/datasets> (GTEx Analysis V6) or in BESD format through <https://cnsgenomics.com/software/smr/#eQTLsummarydata>. The Genotype-Tissue Expression (GTEx) project was supported by the Common Fund of the Office of the Director of the National Institutes of Health (<http://commonfund.nih.gov/GTEx>). Additional funds were provided by the National Cancer Institute (NCI), National Human Genome Research Institute (NHGRI), National Heart, Lung, and Blood Institute (NHLBI), National Institute on Drug Abuse (NIDA), National Institute of Mental Health (NIMH), and National Institute of Neurological Disorders and Stroke (NINDS). Donors were enrolled at Biospecimen Source Sites funded by Leidos Biomedical, Inc. (Leidos) subcontracts to the National Disease Research Interchange (10XS170) and Roswell Park Cancer Institute (10XS171). The Laboratory, Data Analysis, and Coordinating Center (LDACC) was funded through a contract (HHSN268201000029C) to The Broad Institute, Inc. Biorepository operations were funded through a Leidos subcontract to the V an Andel Institute (10ST1035). Additional data repository and project management were provided by Leidos (HHSN261200800001E). The Brain Bank was supported by a supplement to University of Miami grant DA006227. J.R.D. is supported by a Lucille P. Markey Biomedical Research Stanford Graduate Fellowship. J.R.D., Z.Z., and N.A.T. acknowledge the Stanford Genome Training Program

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#### **GWAS of Alzheimer’s disease by Schwartzenruber et al.**

The summary statistics from the meta-analysis are available through the National Human Genome Research Institute-European Bioinformatics Institute GWAS catalog under accession nos. GCST90012877 and GCST90012878 (<https://www.ebi.ac.uk/gwas/downloads/summary-statistics>). This work was funded by Open Targets (OTAR037). We thank J. Barrett for guidance during the initiation of the project and K. Alasoo for early access to the eQTL Catalogue. We thank A. Ruiz for



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### **GWAS of Lewy body dementia by Chia et al.**

Individual-level sequence data for the resource genomes have been deposited at dbGaP (accession no. phs001963.v1.p1 NIA DementiaSeq). The GWAS summary statistics have been deposited in the GWAS catalog: <https://www.ebi.ac.uk/gwas/home>. We thank contributors who collected samples used in this study, as well as patients and families, whose help and participation made this work possible. We would like to thank Ms. Cynthia Crews for her technical assistance with DNA extractions. This research was supported in part by the Intramural Research Program of the National Institutes of Health (National Institute on Aging, National Institute of Neurological Disorders and Stroke; project numbers: 1ZIAAG000935 [PI Bryan J. Traynor, MD PhD], 1ZIANS003154 [PI Sonja W. Scholz, MD PhD], 1ZIANS0030033 and 1ZIANS003034 [David S. Goldstein, MD PhD]). Drs. Sidransky, Lopez and Tayebi were supported by the Intramural Research Program of the National Human Genome Research Institute. We would like to thank members of the International Parkinson's Disease Genomics Consortium for providing genotyping data from 100 random Parkinson's disease cases; these data are publicly available on dbGaP (phs00918.v1.p1). Dr. Besser gratefully acknowledges support from the National Institutes of Health (NIA K01AG063895). The American Genome Center is supported by the Department of Defense award: HU0001-18-20038 and in part by an NHLBI grant: IAA-A-HL-007.001. The opinions and assertions expressed herein are those of the author(s) and do not necessarily reflect the official policy or position of the Uniformed Services University or the Department of Defense, or the Henry M. Jackson Foundation for the Advancement of Military Medicine, Inc. or the U.S. Government. The American Genome Center receives administrative and programmatic support from the Henry Jackson M. Foundation for the Advancement of Military Medicine. This paper represents independent research partly funded by the National Institute for Health Research (NIHR) Biomedical Research Centre at South

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### **GWAS of amyotrophic lateral sclerosis by the Project MinE**

The GWAS summary statistics generated in this study are publicly available in the NHGRI-EBI GWAS Catalog at <https://www.ebi.ac.uk/gwas/> (accession IDs GCST90027163 and GCST90027164 for cross-ancestry and European ancestry meta-analyses, respectively) and through the Project MinE website (<https://www.projectmine.com/research/download-data/>). W.v.R. is supported by funding provided by the Dutch Research Council (NWO) [VENI scheme grant 09150161810018] and Prinses Beatrix Spierfonds (neuromuscular fellowship grant W.F19-03). J.J.F.A.v.V. is funded by Projectnumber W.OR20-08 (The "Repeatome" as a basis for new

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### **GWAS of frontotemporal dementia and its subtypes by the International Multiple Sclerosis Genetics Consortium (IMSGC)**

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**GWAS of Parkinson's disease by the International Parkinson's Disease Genomics Consortium**

## **(IPDGC)**

GWAS summary statistics for the post-Chang 23andMe dataset and 23andMe summary statistics included in the studies of Chang and colleagues and Nalls and colleagues will be made available through 23andMe to qualified researchers under an agreement with 23andMe that protects the privacy of the 23andMe participants. Interested investigators should visit <http://research.23andme.com/dataset-access> to submit a request. An immediately accessible version of the summary statistics is available online, excluding Nalls and colleagues, 23andMe post-Chang and colleagues and Web-Based Study of Parkinson's Disease but including all analysed SNPs (<https://bit.ly/2ofzGrk>). After approval from 23andMe, the full summary statistics including all analysed SNPs and samples in this GWAS meta-analysis will be accessible to approved researchers. Underlying participant level International Parkinson's Disease Genomics Consortium data are available to potential collaborators, please contact [ipdgc.contact@gmail.com](mailto:ipdgc.contact@gmail.com). We would like to thank all of the subjects who donated their time and biological samples to be a part of this study. This work was supported in part by the Intramural Research Programs of the National Institute of Neurological Disorders and Stroke (NINDS), the National Institute on Aging (NIA), and the National Institute of Environmental Health Sciences both part of the National Institutes of Health, Department of Health and Human Services; project numbers 1ZIAN003154, Z01-AG000949-02 and Z01-ES101986. In addition this work was supported by the Department of Defense (award W81XWH-09-2-0128), and The Michael J Fox Foundation for Parkinson's Research. John Hardy's contribution was in part supported by MR/N026004/1. This work was supported by National Institutes of Health grants R01NS037167, R01CA141668, P50NS071674, American Parkinson Disease Association (APDA); Barnes Jewish Hospital Foundation; Greater St Louis Chapter of the APDA. The KORA (Cooperative Research in the Region of Augsburg) research platform was started and financed by the Forschungszentrum für Umwelt und Gesundheit, which is funded by the German Federal Ministry of Education, Science, Research, and Technology and by the State of Bavaria. This study was also funded by the German Federal Ministry of Education and Research (BMBF) under the funding code 031A430A, the EU Joint Programme - Neurodegenerative Diseases Research (JPND) project under the aegis of JPND -[www.jpnd.eu](http://www.jpnd.eu)- through Germany, BMBF, funding code 01ED1406 and iMed - the Helmholtz Initiative on Personalized Medicine. This study is funded by the German National Foundation grant (DFG SH599/6-1) (grant to M.S), Michael J

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Add additional rows as needed for each resource type	Include species and sex when applicable.	Include name of manufacturer, company, repository, individual, or research lab. Include PMID or DOI for references; use “this paper” if new.
Antibody	NA	NA
Bacterial or Viral Strain	NA	NA
Biological Sample	NA	NA
Cell Line	NA	NA
Chemical Compound or Drug	NA	NA
Commercial Assay Or Kit	NA	NA
Deposited Data; Public Database	Phenome-wide GWAS summary data	MRC IEU OpenGWAS Project
Deposited Data; Public Database	Blood pQTL database	PhenoScanner
Deposited Data; Public Database	Dorsolateral prefrontal cortex pQTL	ROSMAP;10.1038/s41588-020-00773-z
Deposited Data; Public Database	Dorsolateral prefrontal cortex pQTL (controls only)	ROSMAP;10.1016/j.ajhg.2021.01.012
Deposited Data; Public Database	Dorsolateral prefrontal cortex pQTL	BANNER;10.1016/j.ajhg.2021.01.012
Deposited Data; Public Database	Parietal lobe cortex pQTL	WU;10.1038/s41593-021-00886-6
Deposited Data; Public Database	Plasma pQTL	INTERVAL;10.1038/s41586-018-0175-2
Deposited Data; Public Database	Plasma pQTL	KORA;10.1038/ncomms14357
Deposited Data; Public Database	Serum pQTL	AGES Reykjavik;10.1126/science.aaq1327
Deposited Data; Public Database	Whole blood eQTL	GTEEx;10.1038/nature24277
Deposited Data; Public Database	Alzheimer’s disease GWAS summary statistics	UKB, ADGC, CHARGE, EADI;10.1038/s41588-
Deposited Data; Public Database	Amyotrophic lateral sclerosis GWAS summary statistics	Project MinE;10.1038/s41588-021-00973-1
Deposited Data; Public Database	Frontotemporal dementia GWAS summary statistics	IFGC;10.1016/S1474-4422(14)70065-1

Deposited Data; Public Database	Lewy body dementia GWAS summary statistics	NA;10.1038/s41588-021-00785-3
Deposited Data; Public Database	Multiple sclerosis GWAS summary statistics	IMSGC;10.1126/science.aav7188
Deposited Data; Public Database	Parkinson's disease GWAS summary statistics	IPDGC;10.1016/S1474-4422(19)30320-5
Genetic Reagent	NA	NA
Organism/Strain	NA	NA
Peptide, Recombinant Protein	NA	NA
Recombinant DNA	NA	NA
Sequence-Based Reagent	NA	NA
Software; Algorithm	R software v4.0.2.	Bell Laboratories
Transfected Construct	NA	NA
Other	NA	NA

**ABLE**

<b>Identifiers</b>	<b>Additional Information</b>
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Neurodegenerative diseases are among the most prevalent and devastating neurological disorders, but few effective prevention and treatment strategies are available. Through integrating genetic and proteomic data, Ge et al. systematically screened and validated the causal relationships between proteomes and risks of neurodegenerative diseases and assessed the safety and druggability of targets. They prioritized 22 potential targets associated with lifetime risks of neurodegenerative diseases. These findings will facilitate the development of novel drugs for neurodegenerative diseases.