








# GALC variants affect galactosylceramidase enzymatic activity and risk of Parkinson's disease

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The association between glucocerebrosidase, encoded by *GBA*, and Parkinson's disease (PD) highlights the role of the lysosome in PD pathogenesis. Genome-wide association studies in PD have revealed multiple associated loci, including the *GALC* locus on chromosome 14. *GALC* encodes the lysosomal enzyme galactosylceramidase, which plays a pivotal role in the glycosphingolipid metabolism pathway. It is still unclear whether *GALC* is the gene driving the association in the chromosome 14 locus and, if so, by which mechanism.

We first aimed to examine whether variants in the *GALC* locus and across the genome are associated with galactosylceramidase activity. We performed a genome-wide association study in two independent cohorts from (i) Columbia University; and (ii) the Parkinson's Progression Markers Initiative study, followed by a meta-analysis with a total of 976 PD patients and 478 controls with available data on galactosylceramidase activity. We further analysed the effects of common *GALC* variants on expression and galactosylceramidase activity using genomic colocalization methods. Mendelian randomization was used to study whether galactosylceramidase activity may be causal in PD. To study the role of rare *GALC* variants, we analysed sequencing data from 5028 PD patients and 5422 controls. Additionally, we studied the functional impact of *GALC* knockout on alpha-synuclein accumulation and on glucocerebrosidase activity in neuronal cell models and performed *in silico* structural analysis of common *GALC* variants associated with altered galactosylceramidase activity.

The top hit in PD genome-wide association study in the *GALC* locus, rs979812, is associated with increased galactosylceramidase activity ( $b = 1.2$ ;  $SE = 0.06$ ;  $P = 5.10 \times 10^{-95}$ ). No other variants outside the *GALC* locus were associated with galactosylceramidase activity. Colocalization analysis demonstrated that rs979812 was also associated with increased galactosylceramidase expression. Mendelian randomization suggested that increased galactosylceramidase activity may be causally associated with PD ( $b = 0.025$ ,  $SE = 0.007$ ,  $P = 0.0008$ ). We did not find an association between rare *GALC* variants and PD. *GALC* knockout using CRISPR–Cas9 did not lead to alpha-synuclein accumulation, further supporting that increased rather than reduced galactosylceramidase levels may be associated with PD. The structural analysis demonstrated that the common variant p.I562T may lead to improper maturation of galactosylceramidase affecting its activity.

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Our results nominate *GALC* as the gene associated with PD in this locus and suggest that the association of variants in the *GALC* locus may be driven by their effect of increasing galactosylceramidase expression and activity. Whether altering galactosylceramidase activity could be considered as a therapeutic target should be further studied.

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## Introduction

The most recent genome-wide association study (GWAS) in Parkinson's disease (PD) revealed multiple novel loci,<sup>1</sup> most of them located in non-coding DNA.<sup>2</sup> Since the top variants are in linkage disequilibrium with multiple other variants across multiple genes in each locus, in most cases it is unclear which variant and which gene is causally associated with the disease.<sup>3</sup> The mechanisms behind the association of variants identified by GWASs are also mostly unknown. The effects of such variants can be mediated by changes in nearby gene expression, splicing, structural, biochemical or other functional properties of the translated protein, and they could be tissue-specific.<sup>4,5</sup> Computational tools such as fine-mapping, genetic colocalization and Mendelian

randomization (MR), as well as functional studies, may help identify these variants and genes and provide evidence for potential mechanisms.<sup>6,7</sup>

There is mounting evidence about the role of lysosomal dysregulation in PD.<sup>8,9</sup> Variants in the lysosomal gene *GBA*, encoding the lysosomal enzyme glucocerebrosidase (GCase), are very common risk factors for PD worldwide.<sup>10–12</sup> GCase is an important enzyme in the glycosphingolipid metabolism pathway within the lysosome, and *GBA* risk variants in PD are associated with reduced GCase activity.<sup>13,14</sup> Other lysosomal genes and enzymes involved in this pathway have also been implicated in PD, such as *SMPD1*,<sup>15</sup> *ASAH1*<sup>16</sup> and *GLA*.<sup>17</sup> Two recent GWAS meta-analyses have identified an association with PD of a locus on chromosome 14 encompassing *GALC*, but also additional genes.<sup>1,18</sup> *GALC* encodes galactosylceramidase (GalCase), an important enzyme in the

glycosphingolipid metabolism pathway responsible for the degradation of galactosylceramides and galactosylsphingosines.<sup>19</sup> However, it is not clear whether GALC is the gene associated with PD in the locus on chromosome 14, and whether this association might be related to its activity in the glycosphingolipid metabolism pathway. There are currently several drugs in clinical trials targeting GBA and the glycosphingolipid metabolism pathway,<sup>20</sup> and it is important to identify other druggable targets in this pathway for future development.

In this study, we aimed to examine whether common GALC variants that are associated with PD, as well as other variants in this locus and across the genome, affect GalCase activity and whether GalCase activity itself may be associated with PD. First, we performed a GWAS on GalCase activity in two independent cohorts, followed by a meta-analysis with a total of 976 PD patients and 478 controls. We further performed colocalization analyses of the GALC locus with its expression, as well as with GalCase activity. We used MR to examine whether GalCase activity may be causally associated with PD. To study whether rare GALC variants may also be associated with PD, we analysed sequencing data from 5028 PD patients and 5422 controls. Additionally, we studied the functional impact of GALC knockout on alpha-synuclein accumulation and on GalCase activity in human neuronal cell models and performed *in silico* structural analysis of GalCase variants.

## Materials and methods

### Study population

GWAS was performed in two cohorts with available data on enzymatic activity. The Columbia University cohort (New York) and the Parkinson's Progression Markers Initiative (PPMI) cohort (detailed in Table 1). Both cohorts have been previously described in detail.<sup>14,21,22</sup> Rare variants analysis was performed in three cohorts sequenced at McGill University from Columbia University, McGill University (Quebec, Canada and Montpellier, France) and Sheba Medical Center (Table 1). In addition, rare variants analysis was performed in the Accelerating Medicines Partnership-Parkinson Disease (AMP-PD) initiative cohorts (<https://amp-pd.org/>). The AMP-PD analysis included 2607 PD patients and 3797 controls from the BioFIND study, Harvard Biomarkers Study (HBS), National Institute of Neurological Disorders and Stroke (NINDS) Parkinson's disease Biomarkers Program (PDBP), PPMI and the NINDS Study of Isradipine as a Disease Modifying Agent in Subjects With Early PD, Phase 3 and the National Institute on Aging (NIA) International Lewy Body Dementia Genetics Consortium Genome Sequencing in Lewy body dementia case-control cohort (Table 1). All PD patients were diagnosed according to either the UK Brain bank criteria<sup>23</sup> or the Movement Disorders Society (MDS) criteria.<sup>24</sup> All participants signed informed consent forms in their respective cohorts and the study protocol has been approved by the institutional review boards.

### Enzymatic activity

GalCase enzymatic activity was measured from dried blood spots (DBS).<sup>25</sup> In the Columbia cohort, DBS have been collected and analysed as previously described.<sup>14,26</sup> In brief, GalCase activity was measured in all available samples at Sanofi laboratories using liquid chromatography-tandem mass spectrometry from DBS, incorporated in a multiplex assay. DBS were incubated with a reaction cocktail containing substrates for lysosomal enzymes and buffer

to maintain the reaction pH. The calculation of enzyme activity was carried out on the assumption that the amount of the obtained product after incubation with the substrate is directly proportional to the activity of lysosomal enzymes in a DBS.<sup>26</sup> In the PPMI cohort, GalCase activity was measured using a similar method, after thawing frozen blood collected in EDTA tubes (kept at  $-80^{\circ}\text{C}$ ) as previously described.<sup>21</sup> In brief, frozen whole blood was slowly thawed on watered ice within 45–60 min. Once thawed, DBS from frozen blood was prepared and stored in individual sealed plastic bags with a desiccant at  $-80^{\circ}\text{C}$  until analysis. Most of the participants from the PPMI cohort have provided blood samples for three consecutive years. The mean activity across all time points was calculated for the PPMI cohort and was used for further analyses as previously described.<sup>21</sup> Outliers with activity  $> \pm 3$  z-scores were excluded from the analysis. We applied logistic regression models in R to compare activity in cases and controls.

### Genome-wide association analysis

Genotyping was performed using the OmniExpress GWAS array according to the manufacturer's instructions (Illumina Inc.). Quality control was performed on both individual and variant-level data as previously described (<https://github.com/neurogenetics/GWAS-pipeline>). In brief, we used the unimputed data to filter out heterozygosity outliers with an F-statistic cut-off  $> \pm 0.15$ , samples with low call rate ( $< 95\%$ ) and samples with a mismatch between the reported and genetically identified sex. On the variant-level data, we excluded variants with high missingness and variants deviating from the Hardy-Weinberg equilibrium ( $P < 1 \times 10^{-5}$ ). We performed imputation using the Michigan imputation server with the Haplotype Reference Consortium reference panel r1.1 2016 under default settings.<sup>27</sup> In the GWAS analysis, we only included hard-call variants ( $R^2 > 0.8$ ) with minor allele frequency  $> 0.01$ . GWAS was performed using logistic regression in plink v.1.9 adjusting for sex, age, disease status and five principal components.<sup>28</sup> In the PPMI cohort, we also adjusted for white blood cell count as suggested previously.<sup>21</sup> Conditional and joint analyses were performed to identify independent single nucleotide polymorphisms (SNPs) in the GWASs after adjusting for the top hits.<sup>29</sup> GWAS meta-analysis between the Columbia and PPMI cohorts was conducted using the METAL package in R.<sup>30</sup> Mirror Manhattan plots were created with the Hudson R package (<https://github.com/anastasia-lucas/hudson>).

### Colocalization analysis

Genomic colocalization analysis allows for fine-mapping of genetic loci and provides an estimation of the overlap between risk variants and quantitative trait locus (QTL) variants. In other words, colocalization allows for determining whether the same variants that affect risk also affect traits such as expression of the nearby genes. We used the LocusCompareR package to plot GWAS-eQTL colocalization events (<https://github.com/boxiangliu/locuscomparer>). Colocalization analysis was performed using the coloc R package (<https://chr1swallace.github.io/coloc/index.html>).<sup>31</sup> To perform colocalization we extracted variants from the region  $\pm 500$  kb around GALC. As a reference, to use the largest dataset available, we used the recent full PD GWAS summary statistics including data from 23andMe<sup>1</sup> and GalCase activity GWAS summary statistics derived from the previous analysis. As a reference for expression QTL (eQTL) we used a recent large-scale brain eQTL meta-analysis.<sup>32</sup> Colocalization analysis considers five hypotheses: H0, no association with PD or QTL in the region; H1, association with PD only;

Table 1 Demographic data of the cohorts to study GalCase activity and rare variants in GALC

Cohort	PD (males %)	Controls (males %)	PD age, mean (SD in years)	Controls age, mean (SD in years)
Demographic data of the cohorts to study GalCase activity				
Columbia	649 (65.3%)	337 (39%)	64.20 (10.69)	65.58 (11.07)
PPMI	327 (67%)	141 (68%)	62.01 (9.41)	61.32 (10.88)
Demographic data of the cohorts to study rare variants in GALC				
Columbia	954 (65%)	506 (36%)	65.73 (10.54)	64.32 (10.06)
Sheba	686 (61%)	549 (69%)	63.11 (12.29)	33.94 (8.18)
McGill	781 (62%)	570 (44%)	59.09 (10.77)	55.22 (12.49)
AMP-PD	2341 (62%)	3486 (47%)	64.66 (9.73)	68.39 (13.43)

H2, association with QTL only; H3, both PD and QTL are associated with the studied region but have different and independent single associated variants and H4, both PD and QTL are associated and share the same single associated variant. We considered the colocalization analysis as significant if the posterior probability of colocalization in H4 (PPH4) was  $>0.8$ .<sup>31</sup>

### Mendelian randomization

Mendelian randomization is a method that allows for testing potential causality between different traits using genetic data. We performed MR to study the potential causal relationship between the levels of GalCase activity and PD. As exposure, we used the GWAS summary statistics that we generated for GalCase activity in the Columbia cohort, the PPMI cohort and the meta-analysed data. PD risk GWAS summary statistics were used as an outcome.<sup>1</sup> Genetic instruments for the exposure were constructed using only GWAS significant SNPs ( $P < 5 \times 10^{-8}$ ). We used a clumping window of 10 000 kb and the  $r^2$  threshold was set to 0.02.

To exclude instruments that explain more variance in the outcome (PD risk) than in exposure (GalCase activity), we applied Steiger filtering.<sup>33</sup> The two-sample MR R package was used to perform MR.<sup>33,34</sup> The MR-Egger method was used to account for directional pleiotropy and to estimate the true causal effect.<sup>35</sup> We used the inverse-variance weighted (IVW) method to aggregate and meta-analyse estimates from individual Wald ratios for each SNP.<sup>36</sup> To identify invalid instruments due to the horizontal pleiotropy, Cochran's Q statistic implemented in IVW and MR-Egger methods was used. The MR pleiotropy residual sum and outlier global test was also used to detect horizontal pleiotropy.<sup>37</sup>

### Gene burden analysis

We performed full sequencing of GALC in the cohorts from Columbia University, McGill University and the Sheba Medical Center, using targeted next-generation sequencing with molecular inversion probes, as previously described.<sup>38</sup> The quality control was performed as previously described,<sup>38</sup> with minimal coverage of 30x for variant calls. The full protocol is available at [https://github.com/gan-orlab/MIP\\_protocol](https://github.com/gan-orlab/MIP_protocol) and the code is available at <https://github.com/gan-orlab/MIPVar/>.

Whole-genome sequencing data was available through the AMP-PD portal.<sup>39</sup> Quality control on whole-genome sequencing performed by AMP-PD on individual and variant levels was previously described (<https://amp-pd.org/whole-genome-data>). We have included only individuals with European ancestry from AMP-PD cohorts as there were not enough participants of other ethnicities to perform a meaningful analysis.

Genotype data from the McGill cohorts were annotated with hg19, and GALC coordinates were chr14:88,399,358-88,459,615;

genotype data from AMP-PD were annotated with hg38, and coordinates for extraction were chr14:87,933,014-87,993,182. To meta-analyse these cohorts we used the LiftOver package to convert all genome positions to hg19 (<https://genome.sph.umich.edu/wiki/LiftOver>). To study the burden of rare variants (minor allele frequency  $<0.01$ ), we used the optimized sequence kernel association test (SKAT-O) and metaSKAT R packages.<sup>40,41</sup> SKAT-O analysis of the GALC gene was performed separately for different types of variants: (i) all rare variants; (ii) all variants with a combined annotation dependent depletion score  $\geq 20$  (representing 1% of the top deleterious variants); (iii) all non-synonymous variants; and (iv) all functional variants including non-synonymous and loss-of-function variants (stop gain/loss, frameshift and splicing variants located within two base pairs of exon-intron junctions).

### In silico structural analysis

The atomic coordinates of the full-length human GalCase protein were retrieved from the AlphaFold server and compared with the structure of mouse GalCase bound to 4-nitrophenyl beta-D-galactopyranoside (PDB 4CCC). The figure was generated using PyMol v.2.4.0.

### Generation and differentiation of human induced pluripotent stem cell lines

CRISPR-Cas9 genome editing was used to individually ablate the GALC or the GBA loci in AIW002-02 human induced pluripotent stem cells (iPSCs).<sup>42</sup> Quality control of the parental line was carried out as previously described.<sup>42</sup> A pair of guide RNAs expressed together with Cas9 nuclease from PX459 (Addgene no. 48139) by transient transfection with Lipofectamine Stem (ThermoFisher Scientific, STEM00001) was used to target each locus in iPSCs: GGCTGGGAAAAGGTTTCGAC and GTCCAAATCATGGTAACGCT for the GALC locus; TAAAAGCTTCGGCTACAGCT and GCTATGAGAGTACACGAGT for the GBA locus. Following puromycin selection, colonies were picked and screened by PCR and sequencing. The sequences of the screening primers were: TTGGTAAGGGTCTTGAGAGA and AAACCCAGCTCAGAGGAAGG for the GALC locus; TTTTGGCTCATTCCAACCTC and TTGAGAGCAGCAGCATCTGT for the GBA locus. Both knockout lines were screened for pluripotency by immunofluorescence and for genomic integrity using the hPSC Genetic Analysis Kit (Stemcell Technologies, 07550) as described.<sup>42</sup> The wild-type and knockout iPSC lines were subsequently transduced with lentiviruses to generate lines that had the capacity to differentiate into Ngn2-induced neurons based on a protocol adapted from Zhang et al.<sup>43</sup> and Meijer et al.<sup>44</sup> and characterized by immunofluorescence for neuronal markers (data not shown). SNCA triplication, Isogenic control (Isog



Ctl) and SNCA KO NPCs were differentiated by the monolayer method from iPSCs.<sup>45</sup>

### GCCase activity and alpha-synuclein accumulation assays

Neuronal lysates were extracted for *in vitro* GCCase activity measurements using 4-methylumbelliferyl- $\beta$ -D-glucopyranoside (Sigma Aldrich, M3633) as described previously.<sup>46</sup> Alpha-synuclein accumulation was monitored by western blotting using mouse anti-alpha-synuclein (BD Biosciences, 610787) in whole cell lysates and in Triton-soluble and -insoluble fractions. The fractionation was done as described previously.<sup>47</sup>

### Standard protocol approvals, registrations and patient consents

The institutional review boards approved the study protocols, and informed consent was obtained from all participants before entering the study. 23andMe participants provided informed consent and participated in the research online, under a protocol approved by the external AAHRPP-accredited Institutional Review Board (IRB), Ethical & Independent Review Services (E&I Review). Cohorts sequenced at McGill University from Columbia University, McGill University (Quebec, Canada and Montpellier, France) and Sheba Medical Center received approval from McGill IRB (A11-M60-21A). The PPMI cohort, AMP-PD initiative cohort data available for qualified researchers under an agreement and does not require additional internal IRB approval.

### Data availability

All code is available at our git-hub <https://github.com/gan-orlab/GALC>. Data used in the preparation of this article were obtained from the AMP-PD Knowledge Platform (<https://www.amp-pd.org>) and PPMI ([www.ppmi-info.org](http://www.ppmi-info.org)). All the variants used for the burden analyses are detailed in the provided Supplementary tables and the burden analysis can be repeated using these tables. The full GWAS summary statistics for the 23andMe discovery data set will be made available through 23andMe to qualified researchers under an agreement with 23andMe that protects the privacy of the 23andMe participants. Please visit [research.23andme.com/collaborate/](https://research.23andme.com/collaborate/) for more information and to apply to access the data.

## Results

### PD risk variants in the GALC locus are associated with increased GalCase enzymatic activity

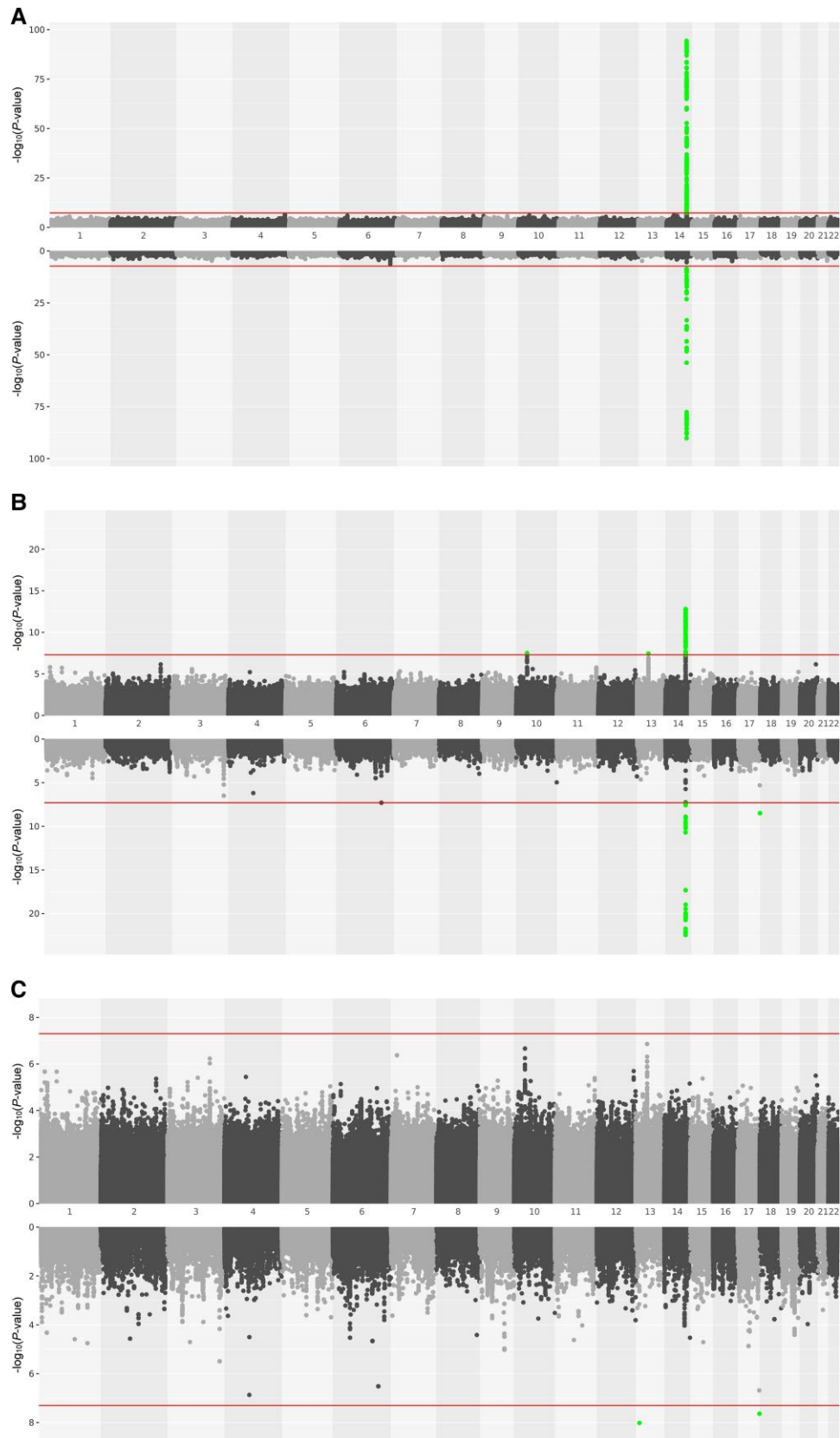
We performed a GWAS to examine the association between common genetic variants and GalCase activity in the Columbia ( $n=976$ ) and PPMI ( $n=468$ ) cohorts. Not surprisingly, the strongest signal was in the GALC region for both cohorts (Fig. 1A). Applying conditional and joint analyses, signals from two independent GALC SNPs were identified in both cohorts (Table 2). The top hits in GALC in PPMI and Columbia cohorts were different, however, the top SNP rs429176 in PPMI GalCase GWAS is almost in complete linkage disequilibrium (LD) ( $D'=0.99$ ;  $R^2=0.97$ ) with the top hit in Columbia cohort rs380142. Moreover, the secondary hits in both cohorts are also in high LD with each other (rs4445832 and rs28533072;  $D'=0.99$ ). In each cohort, the two independent signals had opposite directions of effect, as one SNP was associated with increased GalCase activity, and the

second, independent SNP, was associated with reduced GalCase activity (Table 2). To search for potential secondary hits outside of the GALC locus, we performed GWASs for both cohorts adjusted for the top hits in the GALC locus. First, we adjusted for the top significant SNP and then repeated the GWAS after adjustment for both independent SNPs in the GALC locus (Fig. 1B and C). After adjustment for the top SNP, there were two loci identified in the Columbia University cohort and two loci in the PPMI cohort that passed Bonferroni correction for multiple comparisons (Supplementary Table 1). However, none of these loci that were found in one of the cohorts was replicated in the other. Similarly, after adjusting for both top SNPs in the GALC locus, two loci were associated with GalCase activity in the PPMI cohort but were not replicated in the Columbia University cohort (Supplementary Table 1). In the meta-analysis, only variants in GALC locus were associated with GalCase enzymatic activity (Fig. 2A). No other SNPs outside GALC locus were associated with GalCase activity in the meta-analysis of the two cohorts before and after adjustments for the top independent hit in the GALC locus (Fig. 2B) and for both independent hits (Fig. 2C).

We then examined the effect of the GALC locus SNP rs979812, which was associated with PD in two previous GWAS meta-analyses,<sup>1,18</sup> on GalCase activity. This SNP was strongly associated with increased GalCase enzymatic activity ( $b=1.2$ ;  $SE=0.06$ ;  $P=5.10E-95$ ). This effect was replicated in both cohorts and in the meta-analysis (Table 3). To exclude a possible effect of PD, we analysed this SNP in controls only from both cohorts, with similar results ( $b=1.1$ ;  $SE=0.1$ ;  $P=2.16 \times 10^{-25}$ ). We then examined whether there are coding variants in GALC that are associated with GalCase activity. The major allele of the common non-synonymous variant p.I562T (rs398607), which is in partial LD ( $D'=0.64$ ) with the top PD risk variant in this locus, rs979812, was associated with increased GALC activity ( $b=1.65$ ,  $SE=0.05$ ,  $P=2.70 \times 10^{-242}$ ). This variant is associated with PD but does not reach the level of GWAS significance ( $b=-0.05$ ,  $SE=0.01$ ,  $P=1.51 \times 10^{-06}$ ). We also found two additional common GALC variants that were significantly associated with decreased GalCase activity: p.R184C ( $b=-1.45$ ,  $SE=0.14$ ,  $P=4.18 \times 10^{-24}$ ) and p.A17T ( $b=-0.88$ ,  $SE=0.13$ ,  $P=8.26 \times 10^{-12}$ ), but these variants were not associated with PD. These three common variants were previously reported as modifiers of GalCase enzymatic activity, but they do not cause Krabbe disease in a homozygous state.<sup>48,49</sup> In conjunction with deleterious GALC variants, however, these two variants may cause late-onset Krabbe disease.<sup>49-51</sup> We also compared GalCase enzymatic activity between cases and controls after merging the PPMI and the Columbia cohorts. We saw slightly increased GalCase activity in cases, which did not reach statistical significance ( $b=0.03$ ;  $SE=0.029$ ,  $P=0.29$ ).

### Mendelian randomization supports a potentially causative role of GalCase enzymatic activity in PD

To examine whether increased GalCase activity may be causal in PD, we performed MR using the current summary statistics from our GalCase activity analyses as exposure and summary statistics from the most recent PD GWAS<sup>1</sup> as an outcome. We performed MR using the summary statistics from the analysis of the Columbia University cohort alone, the PPMI cohort alone and their meta-analysis. All three MR analyses demonstrated consistent potentially causative effects on PD risk (Supplementary Fig. 1; Columbia University: IVW,  $b=0.029$ ,  $SE=0.011$ ,  $P=0.006$ ; PPMI: IVW,  $b=0.022$ ,  $SE=0.006$ ,  $P=0.0005$ ; meta-analysis: IVW,  $b=0.025$ ,



**Figure 1** Mirror Manhattan plot of GalCase activity GWAS. The Columbia cohort on the top and the PPMI cohort on the bottom of each plot. The horizontal line indicates GWAS significance threshold. Dots above the line indicate passing the threshold variants. (A) GWAS with no adjustments. (B) GWAS with adjustment for the top SNP associated with GalCase activity. (C) GWAS with adjustment for the two independent SNPs associated with GalCase activity.

Table 2 Conditional and joint analysis identified independent SNPs in GWAS analysis

Cohort	SNP	Ref allele	Freq	Beta	SE	P	Beta_J	Beta_J_se	P_J	LD with PD top hit (rs979812)
PPMI	rs4445832	C	0.4	2.33	0.09	$7.12 \times 10^{-91}$	1.32	0.21	$1.18 \times 10^{-10}$	$D' = 0.98 R^2 = 0.69$
PPMI	rs429176	C	0.45	-2.25	0.09	$1.21 \times 10^{-88}$	-1.32	0.2	$1.73 \times 10^{-11}$	$D' = 0.63 R^2 = 0.30$
Columbia	rs380142	C	0.46	-1.39	0.06	$4.77 \times 10^{-95}$	-1.44	0.08	$9.66 \times 10^{-82}$	$D' = 0.64 R^2 = 0.30$
Columbia	rs28533072	C	0.88	0.39	0.09	$8.79 \times 10^{-6}$	0.57	0.09	$1.68 \times 10^{-10}$	$D' = 1.0 R^2 = 0.24$

Ref allele = reference allele; Freq = minor allele frequency; SE = standard error; Beta\_J = beta joint analysis; P\_J = P-value joint analysis; LD = linkage disequilibrium; PD = Parkinson's disease; PPMI = Parkinson's progression marker initiative.

SE = 0.007,  $P = 0.0008$ ). Taking into account that SNPs in the GALC locus are associated with PD, we applied Steiger filtering to exclude any pleiotropic variants. Moreover, different sensitivity methods did not detect meaningful heterogeneity or pleiotropy (Supplementary Table 2).

### Colocalization suggests that GALC association with PD may be driven by changes in expression

One hypothesis for the association between variants in the GALC locus, GalCase activity and risk of PD, is that variants in this locus may affect the expression levels of GALC, which may lead to increased measured GalCase activity. The top PD risk-associated SNP, rs979812, was associated with both GALC expression and GalCase activity (Fig. 3). Colocalization analysis of the top PD GWAS SNPs with the top GalCase activity GWAS SNPs associated with increased GalCase activity demonstrated colocalization ( $PPH4 > 0.8$ ), indicating that increased expression and GalCase activity is associated with PD. Colocalization analysis with the top GalCase activity GWAS SNPs that were associated with reduced GalCase activity showed no colocalization with PD risk SNPs ( $PPH4 < 0.8$ ), suggesting that reduced GalCase expression and activity are not associated with PD.

### No evidence for association of rare GALC variants with PD

We next aimed to examine whether rare GALC variants may also be associated with PD. We performed targeted sequencing in three cohorts and extracted data from a fourth cohort (Table 1) with a total of 5028 PD patients and 5422 controls. In the three cohorts sequenced at McGill University using targeted sequencing, the average coverage of the GALC gene was 5539x, with 98% of the nucleotides covered at  $\geq 30\times$ . We performed burden analysis using SKAT-O in each of the cohorts separately and then meta-analysed all cohorts. We did not identify any association between rare GALC variants and PD in any of the cohorts and in the meta-analysis (Supplementary Tables 3 and 4).

### Structural analysis of common GalCase variants

The structure of mouse GalCase in complex with substrates and intermediates revealed how the enzyme catalyses the hydrolysis of galactocerebroside.<sup>52,53</sup> The protein consists of an unstructured N-terminal 40-amino acid signal peptide, followed by a b-sandwich, TIM barrel and lectin domains (Fig. 4A). The active site is located in the TIM barrel, adjacent to the lectin domain which binds carbohydrate, thus positioning substrates for cleavage of the glycosidic bond. The structure of human GalCase, predicted using the AlphaFold server,<sup>54</sup> is highly similar to the experimental mouse GalCase structures (83% sequence similarity). This model allows us to predict the effect of two out of the three missense mutations

reported in this study. The p.A17T variant is located in the unstructured signal peptide and therefore its effect cannot be evaluated using our model. On the other hand, the p.R184C and p.I562T variants can be modelled with high certainty. Arg184 is located in the TIM barrel domain and its sidechain is exposed to the solvent (Fig. 4B). The mutation p.R184C causes no steric clash, and would likely not affect substrate binding, given that it is located 33 Å away from the active site. The effect of the p.R184C mutation on GalCase structure is thus likely benign, although we cannot exclude that Arg184 may be involved in some yet unknown protein–protein interaction required for the function or maturation of GalCase. Ile562 is located in the hydrophobic core of the lectin domain (Fig. 4C). The mutation p.I562T would not induce any steric clash, but introduction of a polar amino acid at this position would probably destabilize the fold. Thus, the p.I562T mutation may lead to improper maturation of GalCase, which could interfere with its lysosomal function.

### GALC knockout does not lead to alterations in GCase activity or to alpha-synuclein accumulation in iPSC-derived Ngn2-induced neurons

Last, we sought to examine the effects of altered GalCase activity on PD-associated phenotypes in iPSC-derived neurons. Considering that several genes involved in interconnected lysosomal lipid metabolism pathways have been linked to PD in the GWAS studies described before, including GALC and GBA, we asked whether ablation of the former can affect the activity of the latter. Using an *in vitro* assay, we measured the cleavage of 4-methylumbelliferyl- $\beta$ -D-glucopyranoside catalysed by GCase in wild-type, GALC knockout and GBA knockout lysates. As expected, GBA knockout lysates showed no GCase activity (Fig. 5A). Wild-type and GALC knockout lysates had comparable levels of GCase activity (Fig. 5A). Since lysosomes are major sites of alpha-synuclein degradation, we examined the accumulation of monomeric endogenous alpha-synuclein in steady-state lysates of wild-type, GALC knockout and GBA knockout Ngn2-induced neurons and found similar levels (Fig. 5B). Through further analyses of Triton-soluble fractions, we likewise found comparable levels of monomeric alpha-synuclein in all three lines (Supplementary Fig. 2A). Moreover, we observed no high molecular weight alpha-synuclein oligomers in the Triton-insoluble fractions at steady-state (Supplementary Fig. 2B). This observation stands in contrast to a previous study, which reported that GBA knockout SH-SY5Y neuroblastoma cells exhibit an accumulation of Triton-insoluble alpha-synuclein oligomers compared to wild-type cells.<sup>47</sup> As controls for these experiments, we analysed the levels of monomeric and oligomeric alpha-synuclein in dopaminergic neural progenitor cells (DA-NPCs) from an SNCA triplication line, as well as CRISPR-Cas9-corrected isogenic control and SNCA knockout lines. Consistent with the SNCA gene copy numbers in each of these lines, we detected proportionately more

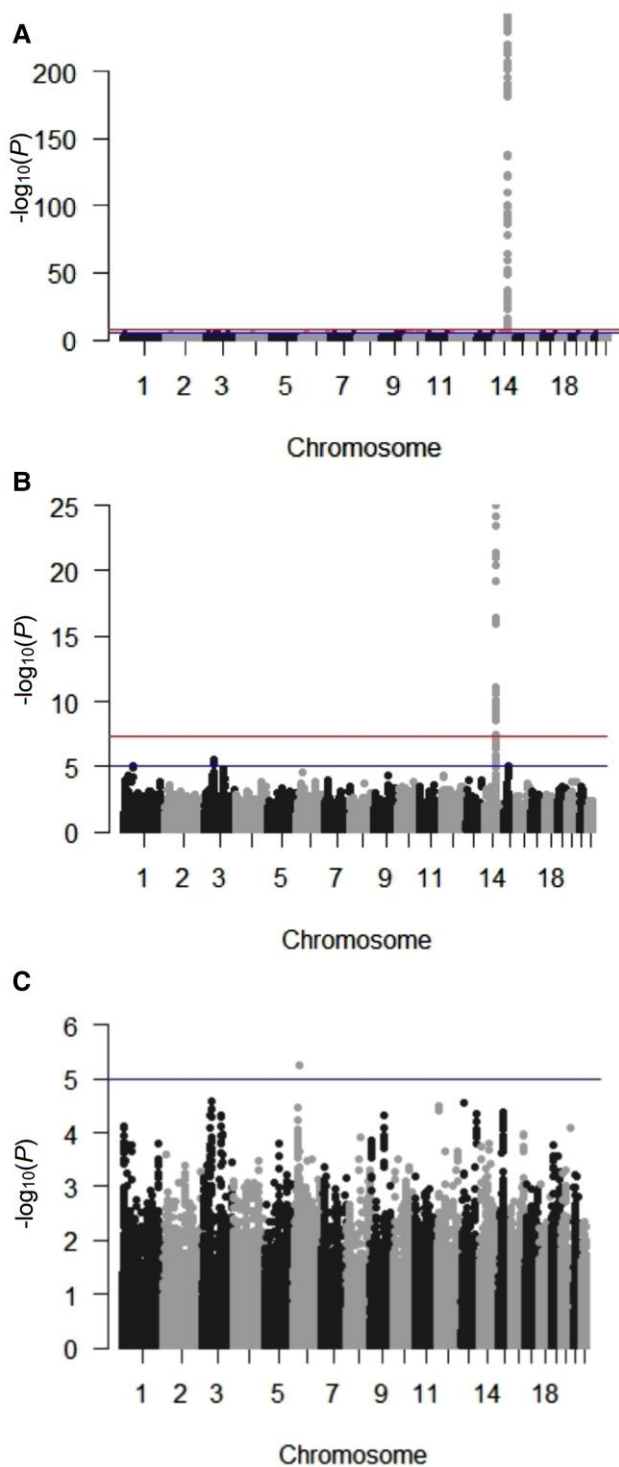


Figure 2 GWAS meta-analysis of GalCase activity between the Columbia and PPMI cohorts. (A) Meta-analysis with no adjustments. (B) Meta-analysis with adjustment for the top SNP associated with GalCase activity. (C) Meta-analysis adjusting for the two independent SNPs associated with GalCase activity.

Triton-soluble monomeric alpha-synuclein in SNCA triplication compared to isogenic control NPC lysates, and none in complete SNCA KO lysates (Supplementary Fig. 3A). Even in the SNCA triplication line, we found no high molecular weight oligomers at steady-state (Supplementary Fig. 3B).

Table 3 Effect of known PD GWAS locus top hit rs979812 near GALC on enzymatic activity

Cohort	Beta	SE	P-value
Columbia cohort	1.000	0.067	$1.82 \times 10^{-45}$
PPMI	1.827	0.117	$3.12 \times 10^{-44}$
Meta-analysis	1.205	0.058	$5.10 \times 10^{-95}$

## Discussion

In the current study, we identified two independent signals at the GALC locus of variants associated with reduced and increased GalCase activity. We show that the variants associated with increased expression and increased activity of GalCase are also associated with PD risk. Using MR, we also show that increased GalCase activity may be causal in PD. Structural analysis of GalCase suggested that the minor allele of p.I562T variant (threonine) may deleteriously affect GalCase function. Since the wild-type amino acid in this allele, isoleucine, is the one associated with PD risk and with increased GalCase activity, it is possible that this variant is one of the variants driving the association in the GALC locus, although there is no full linkage disequilibrium between this variant and the top variant associated with PD risk. This hypothesis requires additional genetic and functional studies. We did not find an association between rare GALC variants and PD, and KO of GalCase in neuronal models identified no effect on monomeric alpha-synuclein accumulation.

For most GWAS loci, the specific gene or genes within each locus that drive the association with PD are unknown. Our results indicate that in this specific locus, the culprit gene may be GALC, specifically through effects on GalCase expression and activity. GalCase works very close and similar to GCase in the lysosomal glycosphingolipid metabolism pathway (Supplementary Fig. 4), which involves other genes and enzymes implicated in PD, including SMPD1,<sup>15</sup> ASAH1<sup>16</sup> and GLA.<sup>17</sup> However, the specific mechanism by which these enzymes are affecting the risk of PD is unclear. Lysosomal genes such as GBA work on glycosphingolipids within the lysosomal membrane, and their dysfunction may alter the composition of the lysosomal membrane.<sup>55</sup> It was hypothesized that these alterations to the membrane composition may affect the ability of the lysosome to internalize and degrade alpha-synuclein.<sup>8</sup> The involvement of multiple genes from this pathway, including GALC, may indicate that maintaining the normal flux within this pathway, and thus maintaining the normal composition of the lysosomal membrane, may be crucial to avoid alpha-synuclein accumulation and the development of PD. Additional studies are required to test this hypothesis, and in the context of our current results, in particular test the effects on increased GalCase activity on the flux in this pathway. Although PD is associated with decreased activity of GCase, we have demonstrated the opposite effect for GalCase. Another possibility is that trafficking of the enzyme is impaired, leading to reduced lysosomal but increased total activity. Nevertheless, a specific mechanism of how increased GalCase is associated with PD is yet to be identified. Future studies with variants that increase GalCase expression and activity may be useful for understanding the mechanism behind the association with PD.

Our MR analysis suggested that increased GalCase activity levels is potentially causal in PD. These results indicate that reducing GalCase activity may become a target for drug development. When considering this, it is important to remember that three



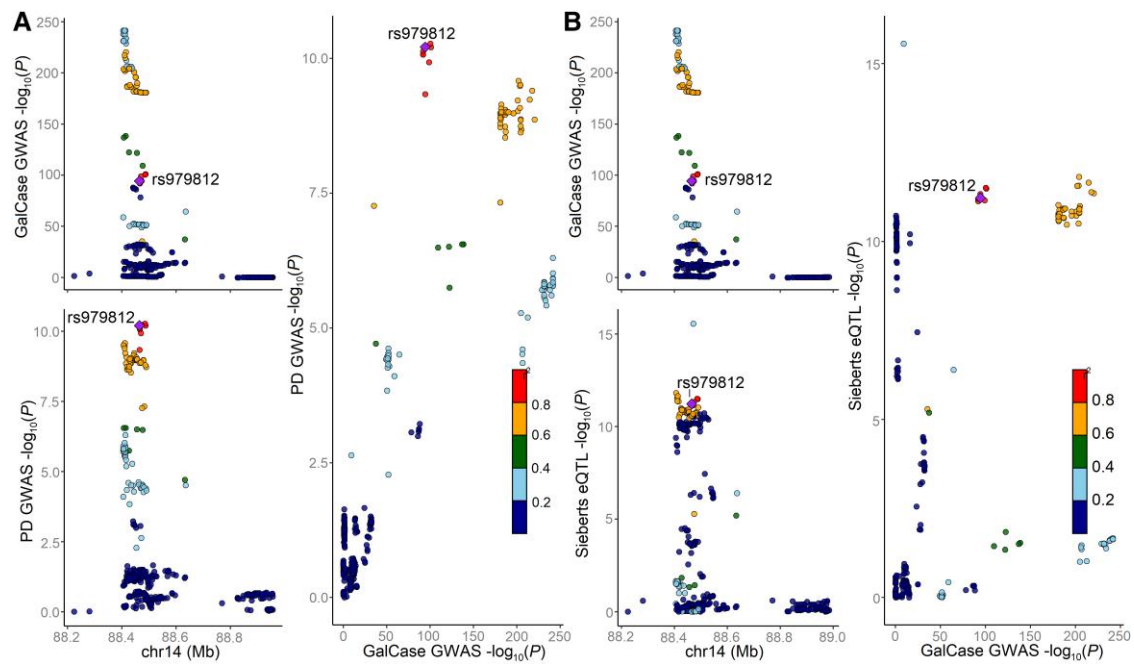


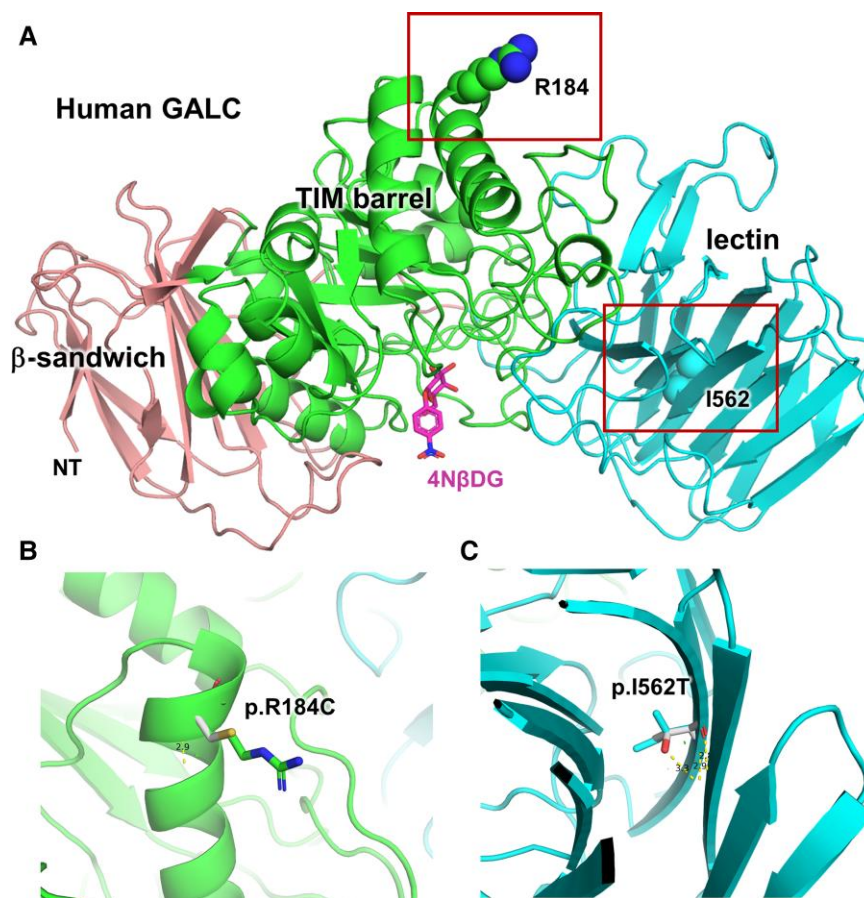
Figure 3 Locus zoom plot comparing GALC locus ( $\pm 500$  kb) in PD GWAS with GalCase GWAS and brain eQTL meta-analysis. (A) PD GWAS plotted together with GalCase activity GWAS meta-analysis. (B) PD GWAS plotted together with brain eQTL meta-analysis.

independent studies did not identify a difference in GalCase activity between PD and controls in the blood<sup>17,56</sup> and in brains of PD patients.<sup>57</sup> Therefore, if such a strategy of reducing GalCase activity levels will be considered, it should be studied in the context of having GALC variants associated with increased activity. Another important point is that MR has some limitations. It is dependent on the quality of the GWASs used for the summary statistics, and despite the tools used to exclude pleiotropic variants, there could still be residual, cryptic pleiotropy.<sup>58</sup> Therefore, our results should be confirmed in additional, independent studies, whether population studies or functional studies in relevant models. Knockout of GALC had no effect on the monomeric alpha-synuclein accumulation in iPSC-derived Ngn2-induced neurons. These results are in line with our results showing that the variants p.R184C and p.A17T that may cause adult-onset Krabbe disease when inherited together with other deleterious GALC variants, thus reducing GalCase activity, are not associated with Parkinson's risk. In addition, our analyses of rare GALC variants, as well as previous studies,<sup>59</sup> suggest minor or no role of rare GALC variants in PD development.

Krabbe disease is a lysosomal storage disorder caused by biallelic deleterious variants in GALC, typically manifesting in infancy with death before the age of 2 years, but also with more benign late-onset forms.<sup>60,61</sup> Several variants in GALC are leading to pseudodeficiency, carriers of these variants have deficient GalCase that do not lead to Krabbe disease.<sup>62</sup> One of these variants, p.I562T, is considered as a benign variant for Krabbe disease, yet the threonine residue, although not pathogenic on its own, may be a modifier of Krabbe disease severity.<sup>49</sup> This also corresponds well with our findings, showing that the activity of the major allele with the amino acid isoleucine is increased compared to the minor allele threonine. The isoleucine allele was also associated with PD risk, although this association is below GWAS-corrected statistical significance threshold. Whether this allele is driving the association in the

GALC region is still unclear, and it is possible that other, non-coding variants in this region, drive the effects on GalCase activity and risk of PD. Comprehensive genomic and direct functional assessment of variants located in the promoter or enhancers of GalCase will be required to identify the specific variant or variants that drive the association and the relevant mechanism.

Our study has several limitations. In some of our cohorts, there was a significant difference in sex between PD patients and controls. This limitation was addressed by adjustment in the regression model with sex as a covariate, as well as other covariates. We have also adjusted for ethnicity in the analysis of the Columbia cohort since there were people with European and Ashkenazi Jewish ancestry. The restriction of our analysis for individuals mainly of European and Ashkenazi Jewish ancestry is also a limitation. In this study, GalCase activity was measured from DBS, including in the PPMI cohort where they were prepared from frozen blood. To account for this difference in preparation, we adjusted for white blood cell count. However, since DBS does not measure the enzymatic activity within the lysosomal environment in live cells, future studies will be required to replicate our results in different models using different methods for measuring enzymatic activity. In the current study we have measured GalCase activity in DBS from peripheral blood, which might not perfectly represent GalCase activity in the brain. However, on the basis of GCCase studies, measured using the same method, we know that GCCase activity measured in DBS is associated with GBA genotype and the results were reproducible across different studies<sup>14,56</sup> and with longitudinal measurements.<sup>21</sup> Moreover, previous findings on GCCase activity in brain<sup>63</sup> were consistent with the DBS results taken from peripheral blood.<sup>14</sup> Taking these data into account, it is plausible that the activity of these lysosomal enzymes in blood is a valuable and reproducible proxy for their activity in the brain. Nevertheless, there are currently no studies that compared activity of lysosomal enzymes simultaneously in brain tissue and peripheral blood. The



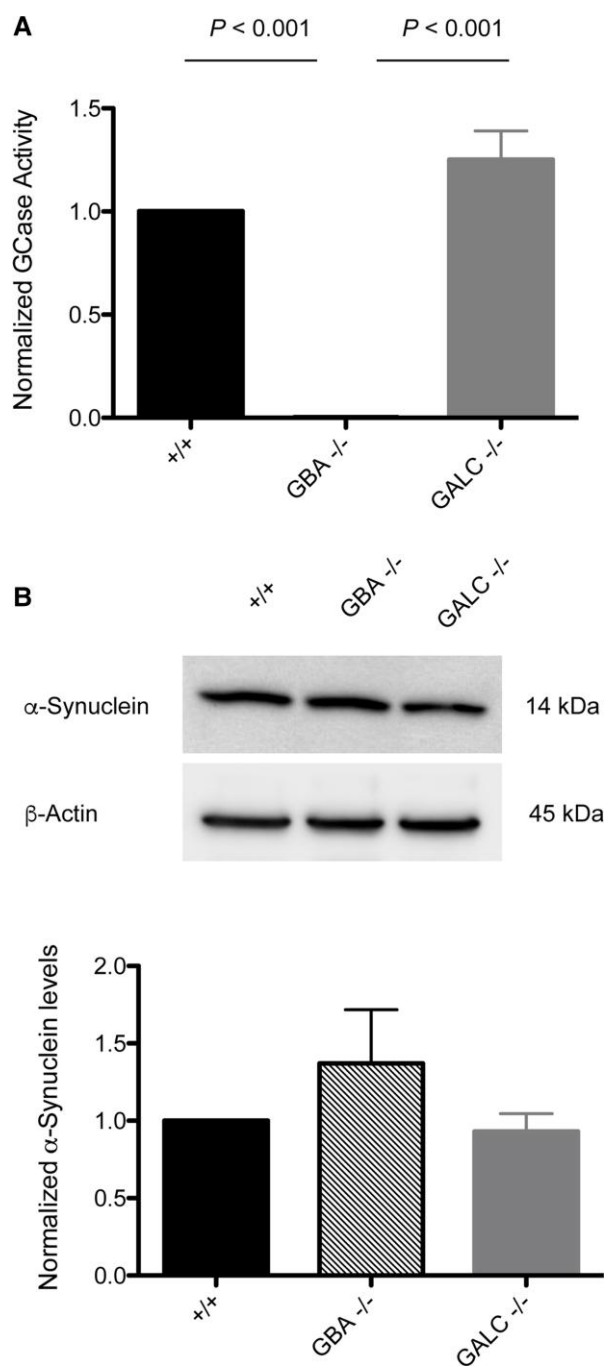
**Figure 4** Structural analysis of GALC variants. (A) AlphaFold model of human GALC. The structure of mouse GALC bound to the chromogenic substrate 4-nitrophenyl beta-D-galactopyranoside (4NβDG, magenta) was superimposed on the human GALC model to indicate the position of the substrate binding site. The side chains of Arg184 and Ile562 are shown as spheres. (B) Effect of the mutation p.R184C. The mutated side chains are shown in white. (C) Effect of the mutation p.I562T. Predicted hydrogen bonds are shown in yellow.

MR analysis that we performed also has several limitations, some of which we described before. The PPMI cohort was included in the PD meta-analysis, which we used as outcome. This will have a very minor effect or no effect at all since the PPMI cohort represents a very small fraction of the Parkinson's GWAS meta-analysis. In addition, the GWAS on GalCase activity was performed in PD cases and healthy controls. Even though we account for it by adjusting for disease status in the regression model, it could still create some biases. Another limitation related to GalCase is that we present results on activity measured from blood, yet GalCase activity could behave differently in brain tissues.

Another limitation of our study is that the cell model we used study is a loss-of-function model, whereas our results indicate that a gain-of-function, i.e. increased expression and activity of GalCase, are associated with risk of PD. In addition, our models do not examine the role of specific variants we identified in this study and the mechanisms by which they potentially influence GalCase expression, activity and risk of PD. Therefore, future studies with additional models are necessary to further delineate the potential mechanisms underlying the association between GalCase expression and activity and risk of PD. Such studies could include the following: (i) overexpression models, preferably in PD-relevant cell models such as neurons and microglia. This can be achieved, for example, by using CRISPR-Cas9-based transcriptional activators in iPSCs, followed by reprogramming to neuron and microglia cells. Using such GalCase overexpression models, different assays could

then be performed, including examining alpha-synuclein accumulation, uptake, degradation and phosphorylation, with and without adding alpha-synuclein pre-formed fibrils, effects on GCCase activity using lysosomal specific substrates, and general effects on lysosomal structure and function. (ii) Models with specific genetic variants implicated in the current study, whether non-coding variants that affect GalCase expression and activity, and/or coding variants that might affect the structure and function of GalCase including p.A17T, p.R184C and p.I562T. Since these variants are not rare, they can be modelled from patient-derived iPSCs and corrected with CRISPR-Cas9 to get isogenic controls. Such models will isolate the effects of these variants in these cell lines, and then use similar assays mentioned before to study their effects on PD-related mechanisms. Other experiments in these models, including localization of GalCase in the lysosome, direct measurements of GalCase activity and others, can also shed more light on the potential mechanisms that may link these variants to PD.

To conclude, our findings support a role for the GALC gene in risk of PD, possibly through alterations in GalCase activity due to genetic variants. These findings suggest that reducing GalCase activity could be considered for pre-clinical translational studies in PD, yet it will likely be relevant only for subgroups of patients with specific genetic background and GalCase activity profiles. Due to the limitations mentioned, and before embarking on translational studies, further genetic and functional studies are required to replicate our findings.



**Figure 5** GALC loss does not affect GCase activity and monomeric alpha-synuclein accumulation in iPSC-derived Ngn2-induced neurons. (A) GCase activity was measured by 4-methylumbelliferyl-β-D-glucopyranoside cleavage and normalized to the wild-type in three independent replicates and compared with Bonferroni corrected t-tests. There is no statistically significant difference between the +/+ and the GALC -/- samples ( $P > 0.05$ ). (B) Monomeric alpha-synuclein levels were measured in the same lysates. All comparisons are not statistically significant (one-way ANOVA,  $P = 0.348$ ).

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## Competing interests

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## Supplementary material

Supplementary material is available at *Brain* online.

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