ORIGINAL RESEARCH ARTICLE

ACCSCIENCE PUBLISHING

Genome-wide analysis identifies non-reference transposable element polymorphisms associated with Parkinson's disease

Supplementary File Supplementary Method

S1. WGS data and RNA-seq quality control

In this study, we performed additional filtering on the WGS data and RNA-seq according to standard quality control (QC) procedures, described as follows: removing duplicated subjects and applying additional QC recommendations proposed by the AMP-PD database to filter out sequencing data pertaining to these subjects (https://amp-pd.org/whole-genome-data; https://amp-pd.org/transcriptomics-data).

S2. Transposable elements discovery

The AMP-PD database aligned WGS sequencing reads with the human reference genome (GRCH38DH). We utilized the aligned cram files with the Mobile Element Locator Tool (MELT, Version 2.2.2)^[1] to detect non-reference transposable elements (TEs) across the human genome. Each module from MELT is described as follows: MELT-IndivAnalysis module identified all non-reference TE insertions in each subject; MELT-GroupAnalysis module merged all non-reference TE insertion events in each subject to determine accurate breakpoint positions, TE insertion lengths, and TE subfamily information, among others. MELT-Genotype module performed TE genotype on each subject's merged non-reference TE insertions, and the resulting genotype data were converted into VCF files using the MELT-MakeVCF module.

S3. Post-discovery quality control of TEs

The MELT-generated raw TE genotyping data underwent QC to retain highly reliable TE insertion results. Specific QC was accomplished using Vcftools (version 0.1.16)^[2], including the following steps: we identified TEs in autosomal regions only, excluding those located on the X and Y chromosomes, as well as genome assembly regions such as chr_random, chrUn_regions, and chr_alternate contigs (ALT). To ensure high quality of TE identification, non-TE sites were filtered out along with TE that contain low complexity regions within 25 bp upstream or downstream. Moreover, TE exhibiting an LP/ RP ratio exceeding two standard deviations and displaying different types of annotations within the same region was also excluded from the study. Finally, the remaining high-quality TEs were consistently named using a chromosome_insertion_ position_TE format based on their insertion position and type.

S4. Pre-genome-wide association studies quality control of TEs

Pre-genome-wide association studies (GWAS) QC was performed on all subjects and TE loci. We used PLINK (version 1.90b6.22) ^[3] and Vcftools (version 0.1.16)^[2] to perform subject and single nucleotide polymorphisms (SNPs) QC. QC steps are shown in Figure S1. The steps were as follows: subjects with overall missingness >0.05 were excluded from the study; TEs with overall missingness >0.05 and Hardy-Weinberg equilibrium (HWE $P < 1 \times 10^{-6}$) were excluded from the study; subjects with heterozygosity rate >4 standard deviation from the mean were also excluded from the study. Subsequently, subjects exhibiting mismatched genders, a heterozygosity rate >4 standard deviation from the mean, and relationships among subjects (PI_HAT > 0.1875) were excluded from the study. Gender verification, heterozygosity assessment, and relationship check were conducted based on SNP data from matched subjects. Principal component analysis was used to exclude the geographical outliers. At last, we retained the TE with an insertion frequency >0.01. In total, 1,910 subjects and 2,867 TEs remained for further analysis.

S5. Pre-TE-linear mixed model quality control of TEs

The QC process before TE-LMM was as follows: selecting subjects and TE loci that have passed quality control for TE-GWAS and patients only. The BioFIND cohort was excluded in this analysis due to the lack of follow-up visit data. Participants with only one follow-up time point were also excluded based on different clinical data. Finally, TE with insertion frequency <0.05 was excluded in the TE-LMM analysis based on various clinical data.

Supplementary Table

Table S1. Quality control for TE-LMM analysis

Clinical phenotype	MOCA	HOEHN and YAHR	MDS-UPDRS I	MDS-UPDRS II	MDS-UPDRS III	MDS-UPDRS IV
Number of subjects	658	683	671	691	691	691
Number of TE sites	2,111	2,088	2,103	2,099	2,099	2,099

Legends: Hoehn and Yahr stage: The Hoehn and Yahr stage is a common scale to describe the progression of motor symptoms in Parkinson's disease. On this scale, Stages 1 and 2 represent early-stage, 2 and 3 mid-stage, and 4 and 5 advanced-stage PD. MDS-UPDRS: MDS-Sponsored Revision of the UPDRS is a comprehensive scale for assessing Parkinson's disease motor and non-motor symptoms. MDS-UPDRS includes four parts: Part I: Non-motor experiences of daily living; Part II: Motor experiences of daily living; Part III: Motor examination; Part IV: Motor complications. MOCA: Montreal Cognitive Assessment, an assessment scale for rapid screening for mild cognitive impairment.

Supplementary Figures



Figure S1. Pre-GWAS quality control of sample and TEs. The gray box indicates that the step is based on the TE polymorphism, while the blue box means that the step is based on the SNP polymorphism of the matched sample. Abbreviations: SD: Standard deviation; TE: Transposable element.



Figure S2. TE-GWAS QQ plot. The quantile–quantile plot shows the observed distribution of *P*-values of outliers for TE-GWAS and its deviation from the expected uniform distribution. The X-axis shows the expected *P*-value after the -log10 transformation. The Y-axis shows the observed *P*-value after the -log10 transformation.



Figure S3. Locuszoom map of the \pm 500 kb range of chr1_246429040_ ALU. The x-axis shows the physical coordinates (GRCh38DH) of each mutation site. The y-axis shows the original *P*-value after -the log10 transformation of each TE association. The red diamond shows chr1_246429040_ALU passing the significant threshold (dashed red line). Different colors correspond to linkage disequilibrium (LD) values between loci. The blue line at the bottom represents the gene structure of this region. Blue arrows indicate the direction of gene transcription.



Figure S4. Impact of TEs on gene expression. QQ plot displays the observed distribution of *P*-values for interaction-TE-eQTL(A), non-interaction-TE-eQTL (D) *cis* loci, and their deviation from the expected uniform distribution, respectively. Distribution of effect values (β) for different types of TE in interaction-TE-eQTL (B) and non-interaction-TE-eQTL (E). The lines within the box represent the median value. The upper and lower ends of the box represent the interquartile range. Proportions of eGene types in interaction-TE-eQTL(C) and non-interaction-TE-eQTL(F).



Figure S5. Gene Ontology (GO) enrichment analysis for eGenes in TE-eQTL. The x-axis shows the number of genes enriched to the pathway or function. The y-axis shows the pathways or functions in which significant genes are involved. (A) GO annotation results of 26 eGenes (27 TE-gene pairs) regulated by *cis* TE sites in interaction TE-eQTL model. (B) GO annotation results of 624 eGenes (800 TE-gene pairs) regulated by *cis* TE sites in non-interaction TE-eQTL model. BP, MF, and CC represent Biological Process, Molecular Function, and Cellular Component groups of GO, respectively.

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