# Distinctive patterns of DNA methylation associated with Parkinson disease

Identification of concordant epigenetic changes in brain and peripheral blood leukocytes

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Abbreviations: PD, Parkinson disease; CpG, cytosine-phosphate-guanine dinucleotide; DMR, differentially methylated regions; GCi, CpG islands

Parkinson disease (PD) is a multifactorial neurodegenerative disorder with high incidence in the elderly, where environmental and genetic factors are involved in etiology. In addition, epigenetic mechanisms, including deregulation of DNA methylation have been recently associated to PD. As accurate diagnosis cannot be achieved pre-mortem, identification of early pathological changes is crucial to enable therapeutic interventions before major neuropathological damage occurs. Here we investigated genome-wide DNA methylation in brain and blood samples from PD patients and observed a distinctive pattern of methylation involving many genes previously associated to PD, therefore supporting the role of epigenetic alterations as a molecular mechanism in neurodegeneration. Importantly, we identified concordant methylation alterations in brain and blood, suggesting that blood might hold promise as a surrogate for brain tissue to detect DNA methylation in PD and as a source for biomarker discovery.

# Introduction

Parkinson disease (PD) is the second most common neurodegenerative disorder in the elderly affecting 2% of the population over 60 years old.<sup>1</sup> The classic form of PD is manifested clinically as a slowly progressive movement disorder with resting tremor and postural instability. Neuropathologically, PD is characterized by the formation of intracytoplasmic inclusions known as Lewy bodies, containing  $\alpha$ -synuclein ( $\alpha$ -syn)<sup>2.3</sup> and by the loss of dopaminergic neurons mainly in the substantia nigra pars compacta, although neurodegeneration has been also reported to occur in the cortex and other brain areas, and these alterations correlate with non-motor symptoms. At the molecular level, accumulation of misfolded  $\alpha$ -syn affects mitochondrial function, autophagy<sup>4</sup> and the expression of several functional groups of genes,<sup>5.6</sup> although the molecular basis of transcriptional deregulation remain elusive.

Epigenetic processes control several neurobiological and cognitive functions, from early brain development and neurogenesis<sup>7</sup> to memory formation, learning and synaptic plasticity.<sup>8</sup> Altered epigenetic mechanisms have also been associated with neurological disorders, including Rett syndrome, autism, schizophrenia and Alzheimer, Huntington, and Parkinson diseases.<sup>9</sup> We recently reported a decay on DNA methylation in the brain of PD subjects, associated with the interaction of  $\alpha$ -syn with DNA methyltransferase 1 (DNMT1) that results in sequestration of DNMT1 in the cytoplasm.<sup>10</sup> Moreover, other studies showed that decreased methylation at *SNCA* intron 1 might contribute to deregulation of  $\alpha$ -syn expression in sporadic PD cases,<sup>11,12</sup> highlighting the involvement of aberrant epigenetic mechanisms in PD pathology.

PD is a multifactorial disease where environmental and genetic factors are intricately associated. Since accurate diagnosis cannot be achieved until clear motor features have developed, which occurs when 50% or more of pigmented neurons in the substantia nigra have been lost, increasing efforts are dedicated to identify early prodromal non-motor symptoms, including autonomic disturbances, olfactory dysfunctions, depression and sleep disorders that may contribute to the precocious diagnosis of PD and to enable therapeutic interventions before major neuropathological damage has occurred. Biomarkers, molecules that represent the particular signature of a pathological process and that can be easily accessed and quantified, represent a new diagnostic tool to monitor disease progression and therapy efficacy.<sup>13</sup> DNA methylation is currently used as a successful biomarker in several

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**Table 1.** Distribution of differentially methylated regions in brain and blood DNA from Parkinson disease patients

Gene name	Brain	Blood
Differentially methylated regions	2908 (0.6%)*	3897 (0.8%)†
Increased methylation <sup>‡</sup>	317	476
Located in Autosomal CHR <sup>§</sup>	131	206
Annotated genes <sup>n</sup>	84	127
Co-variation <sup>¶</sup>	63	
Decreased methylation <sup>‡</sup>	2591	3421
Located in Autosomal CHR <sup>§</sup>	148	174
Annotated genes <sup>n</sup>	90	106
Co-variation <sup>1</sup>		61

Differential methylation analysis threshold included probes with detection *P* value < 0.001 and Delta Beta scores > |0.2| at a *P* < 0.01 and FDR q < 0.001. \*Percentage of DMR from the average number of array probes detected per brain sample at *P* < 0.001 (485 577). †Percentage of DMR from the average number of array probes detected per PBL sample at *P* < 0.001 (485 554). †Probes showing gain or loss of DNA methylation in PD samples comparison to controls. <sup>6</sup>DM probes excluding those located at X and Y-chromosomes. <sup>n</sup>Probes associated with annotated genes. <sup>1</sup>Probes associated with annotated genes in methylation in both, brain and PBL samples.

cancer types,<sup>14-16</sup> and represents a highly promising biomarker for neurodegenerative disorders.<sup>17,18</sup> As emerging techniques allow monitoring DNA methylation from easily accessible peripheral tissues like blood, an important question rises whether DNA methylation changes from peripheral blood leukocytes (PBLs) would correlate with the brain methylome. We investigated genome-wide DNA methylation changes in brain and blood samples from PD patients in comparison to control subjects. We report here differential methylation for several genes previously associated with PD pathology, supporting the role of epigenetic deregulation as a molecular pathological mechanism in neurodegeneration. Importantly, we identified concordant methylation alterations in a subset of genes in PD brain and blood, suggesting that PBLs might represent a good proxy for brain methylation alterations associated with PD and might constitute a new source for biomarker discovery and development.

## **Results and Discussion**

We previously reported a significant decrease in DNA methylation in the frontal cortex of patients with Parkinson disease and the related disorder Dementia with Lewy bodies, associated with the retention of DNMT1 in the cytoplasm.<sup>10</sup> In the present study we further investigated the extent of this epigenetic deregulation by analyzing genome-wide DNA methylation profiles in postmortem frontal cortex samples and peripheral blood leukocytes (PBLs) from the same individuals on a cohort of PD patients (n = 5) in comparison to age-matched healthy control subjects (n = 6). The cases studied did not differ significantly regarding age, brain weight, postmortem interval and years of education. Most PD cases presented low scores on the Mini-Mental State Examination (MMSE) suggestive of cognitive impairment and probable cortical involvement in pathology (**Table S1A**). Although the most striking pathological feature of PD is the loss of dopaminergic neurons in the substantia nigra, neurodegeneration also occurs in the cortex,<sup>19</sup> and variation of the regional volume of frontal cortex is a characteristic of PD manifestations with cognitive impairment,<sup>20,21</sup> underscoring the involvement of this brain structure in PD pathology.

DNA methylation profiles in brain and blood samples from Parkinson disease patients. Methylome analysis was performed using the Infinium Human 450K beadchip and GenomeStudio (both from Illumina). Detection levels were similar among groups, with an average of 485 386 CpG detected at P < 0.01. We first compared the methylation profiles between brain and blood to investigate if PBLs could represent a good source to profile methylation changes associated with PD. We detected 2908 CpG with differential methylation (DM) in the brain and 3897 CpG in the blood of PD cases, representing about 0.6% and 0.8% of the total array probes interrogated, respectively (Table 1). A few recent reports raised some concern about the use of whole blood DNA on methylation studies because the heterogeneity of the white cell types, each having their own particular epigenome, might confound DNA methylation measurements and disease associations.<sup>22,23</sup> Even though, we observed that the overall methylation patterns of brain and blood were similar, with more than 80% of the sites reported as DM being hypomethylated, in agreement with our previous findings (Fig. 1A).<sup>10</sup> In addition, distribution of average  $\beta$  values across samples and tissues showed similar profiles with most CpG clustering in low-methylation (LMF,  $\beta$  values < 20%) and highmethylation fractions (HMF,  $\beta$  values > 80%) in both, brain and blood (Fig. 1B). However, while there were no significant differences between brain and blood in the LMF, there were more CpG in the HMF in PD blood in comparison to control subjects' blood and also to PD brains (One-way ANOVA corrected for multiple observations and Bonferroni post-hoc test, P < 0.05 and P < 0.001 respectively). Consistent with  $\beta$ -value distribution and previous reports,<sup>24</sup> CpG neighborhood context analysis and genomic location distribution was comparable between brain and blood samples, and showed that loci with decreased methylation were more likely to locate at CG islands (CGi) and associated with promoter regions including TSS1500, TSS200 and 1st exon sites; while CpG sites located farther away from islands (open sea) and at the gene bodies were more likely to present increased methylation (Fig. 1C and D). Finally, analysis of annotated genes presenting DM in PD samples regarding Gene Ontology using Panther Classification System (www.pantherdb.org)<sup>25</sup> and clustering by Biological Process, also showed that the same functional groups were affected in brain and blood, with cell communication and cellular and metabolic processes being the more populated clusters (Fig. 1E), and including genes related to apoptosis, a molecular pathway largely implicated in PD.<sup>26</sup>

We performed differential methylation analysis applying the Illumina Custom model after normalization to control probes present in the array and using the control subjects group as reference. We selected probes showing absolute Delta  $\beta$ -values > |0.2| at P < 0.01 (with FDR q < 0.001 to control for multiple



**Figure 1.** DNA methylation profiles of brain and blood in Parkinson disease cases. (**A**) Comparison of the fractions of differentially methylated loci that showed gain or loss of methylation in PD brain and blood. (**B**) Distribution of average  $\beta$  values across samples and tissues showing enrichment in low-methylation (LMF,  $\beta$  values < 20%) and high-methylation fractions (HMF,  $\beta$  values > 80%). IMF, intermediate methylated fraction ( $\beta$  values < 20% and > 80%). \*Significant difference in PD blood in comparison to control subjects' blood (P < 0.05) and to PD brains P < 0.001, One-way ANOVA with correction for multiple observations and Bonferroni post-hoc test). (**C**) CpG neighborhood context analysis in brain and blood samples that showed increased methylation (IM) or decreased methylation (DM) in PD. CG islands Shores are defined as regions up to 2 Kb from the CGi Start or End; Shelves are defined as the next 2 Kb boundaries from CGi shores. (**D**) Genomic location distribution of differentially methylated loci in PD brain and blood samples. TSS1500, CpG sites within 200–1500 bp from the transcription-starting site (TSS). TSS200, CpG sites within 200 bp from the TSS. Body, gene body regions. (**E**) Gene ontology analysis of annotated genes showing differential methylation clustering by biological process.





comparisons) as DM, a threshold previously suggested to improve detection of DM sites in this array platform with 99% confidence.<sup>27</sup> We identified 317 probes in brain and 476 in blood with increased methylation while 2591 probes in brain and 3421 in blood showed decreased methylation in PD (**Table 1**). As gender is a known source of variation for DNA methylation in different tissues,<sup>28,29</sup> we focused our analysis on autosomal loci, which represented about half of DMRs with increased methylation and about 5% of DM sites with decreased methylation in both, brain (**Table S2**) and PBLs (**Table S3**).

Concordant variation of differentially methylated loci in PD brain and blood. We further refined our analysis to the fraction of autosomal probes showing differential methylation and associated with annotated genes, which corresponded to a total of 174 genes in the brain (84 with increased and 90 with decreased methylation in PD) and 233 annotated genes in blood (127 with increased and 106 with decreased methvlation in PD, Table 1). Strikingly, 30% (124/407) of the total autosomal annotated genes with DM presented concordant changes in methylation between brain and blood (63 loci with increased methylation and 61 with decreased methylation respectively, Table 1; Table S4). We performed bootstrap simulations to test the probability of selecting the same 124 probes from both pools of differentially methylated loci in PD brain and blood only by chance (Fig. S1). Random sample generation on 10000 independent iterations, showed only n = 6 common probes that appear in both sets at high frequency, precluding the possibility that we could select 124 genes with concordant methylation alterations by chance. This statistic analysis with a bootstrap approach<sup>30</sup> supported the observation for both, genes with increased and decreased methylation. In addition, we analyzed the possible correlation between changes in methylation recorded in brain and blood, and represented by the individual B-values per probe for each PD case studied (Fig. 2). Linear regression analysis and Spearman correlation coefficients calculated for the 20 top probes with DM in only one tissue or co-varying in both, showed a tight correlation of methylation levels for the probes with concordant methylation changes in both, brain and blood. Once

more, this observation holds true for the probes with increased (Fig. 2A) and decreased methylation (Fig. 2B). Finally, we tested the probability that the changes in methylation observed in blood were independent from the changes in methylation observed for the same probes in the brain by performing a Fisher's exact probability test on DM probes that showed increased or decreased methylation in PD brain and/or blood (Fig. 2C). In both scenarios, the null hypothesis was rejected, supporting a biologically meaningful relationship between the variation of methylation in brain and PBLs. Taken in all,

this analyses suggest that a number of methylation changes in PD is shared between brain and blood, positioning these 124 genes that co-varied among tissues as candidates for biomarker discovery.

In order to determine the potential association of these covarying DM genes with PD pathology, we mined the 30 top changing loci against curated genomic data repositories using NextBio® Disease Atlas (www.nextbio.com).<sup>31</sup> Strikingly, the expression of 73% of DM loci (22/30) was reported deregulated in PD by at least one study, including 4 genes highly associated with PD risk in GWAS (HLA-DQA1, GFPT2, MAPT and MIR886; Table 2), suggesting that alterations in DNA methylation might represent a common molecular mechanism underlying transcriptional deregulation and might be highly relevant to PD pathology. Noteworthy, genetic polymorphisms in GSST1, encoding glutathione S-transferase and GSTTP1, involved in conjugation of electrophiles and protection against reactive oxygen species have been associated with increased risk to PD after exposure to Paraquat, a widely used herbicide that we reported recently to alter adult neurogenesis in PD models.<sup>32</sup> In addition, the expression of major histocompatibility complex class II-related transcript HLA-DQA1 is altered by overexpression of HDAC1, a histone deacetylase increased in prefrontal cortex of patients with schizophrenia and related psychiatric disorders,<sup>33</sup> suggesting that this gene is under a complex epigenetic regulation and its imbalance might trigger cognitive and behavioral pathologies. Furthermore, MIR886 is a highlighted candidate among co-varying genes with decrease methylation, for which more than 8 probes mapping to adjacent CpGs showed significant decay in PD. MIR886 has recently been renamed as Vault RNA 2-1 (vtRNA2-1), precursor of svtRNA2-1a, a small noncoding RNA whose upregulation induces neuronal dysfunction and was reported as an early event in PD pathology.<sup>34</sup>

Despite concerns regarding the use of whole blood as a source for DNA methylation profiling, significant co-variation between brain and blood methylomes was lately reported after weighted correlation network analysis of 2442 Illumina DNA methylation arrays.<sup>35</sup> This meta-analysis identified an age-related comethylation module that can be found in diverse independent data sets. Biological evaluation showed that module membership is associated with CGi status and autosomal chromosome location, two features that characterized our co-varying genes. In addition, functional enrichment analysis revealed that the agingrelated consensus module includes genes involved in nervous system development, neuron differentiation and neurogenesis and also genes known to be downregulated in Alzheimer disease. We identified 10 genes from our co-varying group among the top 1000 members of the aging-related methylation module. Importantly, all of them were associated to PD at NextBio Disease Atlas: SLC12A5, 36-38 ABCA3, 39 FHIT, 36 FAT1, 38 CPLX2, 36-38,40,41 APBA1, 37, 38, 41 MAGI2, 36, 38, 42, 43 CNTNAP2, 38, 39 ATP8A2, 36-40, 44 and SMOC2,38 reinforcing the idea that detection of differential methylation events pertinent to PD pathology is feasible from blood samples, and also rising the possibility of common risk factors for PD and age-associated brain changes mediated by methylation of select genes.

**Table 2.** Differentially methylated autosomal genes that co-varied in brain and blood DNA from PD patients

# A. Genes with increased methylation in PD

	Gene name	Delta beta brain	Delta beta blood
	KCTD5 <sup>40</sup>	0.429	0.465
	VAV237,38,40	0.374	0.426
	MOG <sup>36,38,39</sup>	0.357	0.336
	TRIM10 <sup>38</sup>	0.352	0.397
	<sup>†</sup> HLA-DQA1 <sup>38,49</sup>	0.325	0.290
	ARHGEF1037,38,40	0.319	0.356
	<sup>†</sup> GFPT2 <sup>38,42,50</sup>	0.291	0.253
	*HLA-DRB5 <sup>36</sup>	0.282	0.255
	TMEM9 <sup>37,38</sup>	0.274	0.249
	MRI1 <sup>40</sup>	0.258	0.284
	<sup>†</sup> MAPT <sup>37,38,44,49–52</sup>	0.247	0.295
	HLA-DRB6	0.240	0.279
	LASS3	0.230	0.243
	GSTTP2 <sup>38,41,53</sup>	0.222	0.207
	GSTTP1 <sup>38,42,44</sup>	0.218	0.258
B. (	Genes with decreased	l methylation in PD	
	Gene name	Delta beta brain	Delta beta blood
	DNAJA3	-0.445	-0.511
	*JAKMIP337,40	-0.403	-0.362
	FRK <sup>36,47</sup>	-0.386	-0.341
	LRRC27	-0.382	-0.406
	DMBX1	-0.370	-0.354
	LGALS7	-0.368	-0.380
	FOXK1	-0.317	-0.340
	APBA137,38	-0.312	-0.283
	MAGI2 <sup>36-38,42</sup>	-0.306	-0.228
	SLC25A24 <sup>38</sup>	-0.253	-0.241
	GSTT1 <sup>38,42,44</sup>	-0.239	-0.239
	*MYOM244	-0.228	-0.201
	*†MIR886 <sup>51</sup>	-0.214	-0.242
	TUBA3E	-0.210	-0.210
	TMCO338,40	-0.207	-0.203

Selected genes differentially methylated in brain and blood genomes (top 15 per group). \*Loci with more than 2 probes with differential methylation on the array (Delta  $\beta$  represents average value from all detected probes). <sup>†</sup>Expression deregulated and/or linked to GWAS in PD.

We further validated the findings from the Infinium methylation array by an independent technique. We performed methylation-sensitive restriction/qPCR on brain and blood samples on 5 genes from the co-varying group for which Epitect Methyl II assays (Qiagen) were available to match the CGi covered by array probes. We included *MRI1* and *TMEM9* as candidates with increased methylation (**Fig. 2A and B**) and *GSST1*, *TUBA3E* and *KCNH1* as genes with decreased methylation in the qPCR analysis (**Fig. S2C–E**). Array findings for 80% of tested genes (4/5) were validated by qPCR methods (**Fig. S2**).



**Figure 3.** Effects of drug regimen, age and disease duration on DNA methylation. (**A**) Box plot showing the average β-value of the total probes interrogated per individual PD case. Age at time of death is indicated in (black). Duration of disease, calculated as years elapsed since first PD diagnosis until time of death, is indicated in red. Drug treatment most relevant to PD pathology is indicated in blue. (**B**) Medication details (additional information is presented in **Table S1B**). \*Denotes a patient with record of cancer. Correlation of DNA methylation (average β-value) with age (**C**) or disease duration (**D**) plotted per individual PD subject studied. Blue circle identifies the patient with cancer record. Case ID corresponds with **Figure 4**.

The array platform selected for this study contains multiple probes mapping adjacent to each other and covering different CpGs per annotated gene. We detected probes associated with the same gene and showing opposite changes in methylation for only 6 genes out of 407 genes for which we observed DM in brain and/or blood, including HLA-DRB1, LRKK1, MMEL1, HLA-DQB1, OR12D3 and VAV2 (denoted by \* in **Tables S2–4**). Although all the probes reached significance in our stringent analysis, still the biological interpretation of the effects of these changes in the context of transcriptional regulation need to be further explored.

As mentioned before, clear diagnosis of PD is achieved in the clinic when movement symptoms have clearly being established, and patients are usually started in anti-parkinsonian treatments soon after. All of the PD cases included in our cohort received different drug regimens and the duration of disease also varied among cases (Table S1B; Fig. 3A and B), therefore the question might arise whether the observed epigenetic alterations are due to ongoing PD pathology or rather an effect of medication or age, as the later was associated with DNA methylation decline.<sup>45</sup> Almost no systematic investigation was conducted so far on the impact of

pharmacological treatments on DNA methylation, in particular regarding levodopa/carbidopa, the most widely used dopamine replacement drugs. We plotted the individual methylation values for each PD patient studied (expressed as the average  $\beta$ -value from all interrogated probes/individual). Methylation profiles did not significantly differed among patients (Fig. 3A) and no clear association with therapy was evident. Interestingly, higher methylation levels were observed for one patient with a record of cancer, which is known to greatly alter methylation<sup>46</sup> suggesting that disease might override epigenetic changes due to age and potentially to drugs. Noteworthy, while average  $\beta$ -values did not correlated with age (Fig. 3C), a high Spearman correlation coefficient was observed for duration of disease (Fig. 3D), suggesting that methylation changes might be driven by PD pathological processes.

Finally, we performed unsupervised hierarchical clustering of the individual methylation profiles detected from blood using absolute correlation (Fig. 4) as a test of the potential capacity of methylation profiles to differentiate between control and diseased subjects. Interestingly, the resulting dendogram showed a clear separation between control and PD cases. Although samples were also clustered by gender, male control subjects were closer to female controls than to PD males. The existence of a distinctive DNA methylation pattern than can separate control from disease subjects was previously reported for the related disorder Dementia with Lewy bodies, where an unsurpevised clustering showed a distinct methylation profile in brain.<sup>47</sup>

In conclusion, we report here genome-wide alterations in DNA methylation associated with PD pathology in brain and blood tissues. Although DNA extracted from whole blood represents a complex mixture from different cell types and is highly variable among individuals, we detected similar methylation patterns between both tissues. Importantly, we identified a set of genes whose methylation coordinately varies in brain and blood, with most of these loci previously being implicated in PD pathology. Notably, the individual methylation profiles obtained from blood were able to separate control subjects from PD cases, highly suggesting that peripheral blood leukocytes might represent a good surrogate for brain tissue and opening a new source for biomarker discovery in PD.

### **Materials and Methods**

Samples. All investigations involving human samples have been conducted according to the principles expressed in the Declaration of Helsinki. Approval was obtained from the Institutional Review Board of the University of California San Diego (UCSD), project 111085X. Written informed consent was obtained from all participating subjects, where appropriate.

Human brain samples. Postmortem human brain samples (frontal cortex) were provided by the Alzheimer Disease Research Center at UCSD and the Layton Aging and Alzheimer Research Center from Oregon Health and Science University from patients diagnosed with Parkinson disease (PD, n = 5) and non-demented age-matched control subjects (CT, n = 6). All cases were clinically characterized during life and histopathologically post mortem. Cases with a history of trauma, hemorrhage or infarction were excluded from the study. Post mortem intervals were no longer than 8 h. Genomic DNA was extracted from 25 mg of brain tissue with DNeasy Blood and Tissue kit (Qiagen, # 69504). Genomic DNA isolated from peripheral blood leukocytes (PBLs) was directly obtained from the brain repositories.

DNA methylation microarray. Briefly, 500 ng genomic DNA were converted by bisulfite treatment using the EZ DNA Methylation kit (Zymogen, # D5001) according to the manufacturer's instructions. Genome-wide methylation profiling was performed on 200 ng of bisulfite-treated DNA using the Illumina Infinium HumanMethylation 450k BeadChip (Illumina, # WG-314-1003) at the Case Western Reserve University Department of Genetics and Genome Sciences Genomics Core, following standardized protocols at the facility and according to the manufacturer's instructions. Beadchips were scanned on an Illumina HiScan SQ. The methylation status of a specific CpG site was expressed as  $\beta$  values, calculated as the ratio of the fluorescence intensity signals of the methylated (M) and unmethylated (U) alleles,  $\beta = Max(M,0)/[Max(M,0) + Max(U,0) + 100]$ .  $\beta$  values range between 0 (non-methylated) and 1 (completely



**Figure 4.** Hierarchical clustering of samples based on individual methylation profiles detected from blood. Dendogram showing the unsupervised hierarchical clustering of the 11 cohort subjects using absolute correlation. Control cases (gray) and PD patients (blue) were grouped based on Pearson correlations of whole genome methylation profiles using a  $1 - |\mathbf{r}|$  distance measure and nesting with average linkage method. An average of 485 386 CpG sites/group with detection P < 0.001 were featured in the analysis. Females are represented by circles and males by squares. Numbers represent the individual sample ID.

methylated). The Illumina GenomeStudio Software (version 2011.1) was used to assess quality and extract the DNA methylation signals from scanned arrays. Methylation data was extracted as raw signals with no background subtraction and data was normalized to control probes present on the array. An average of 485 386 probes were detected per sample at P < 0.001 and were incorporated into downstream analysis. Differential methylation analysis was performed using Illumina custom model and threshold for CpG selection was Delta  $\beta$  scores > |0.2| at P < 0.01 and FDR q < 0.001.

Methylation-sensitive restriction qPCR. To independently validate array findings, we performed methylation-sensitive restriction qPCR analysis using EpiTect Methyl II PCR assays (Sa Biosciences/Qiagen). The method is based on the detection of remaining input DNA after cleavage with methylation-sensitive and methylation-dependent restriction enzymes. Following digestion, the remaining DNA is quantified by real-time PCR in each individual enzyme reaction using primers that flank a CpG region of interest that comprise the restriction sites. We performed digestions on 400 ng of brain and PBL genomic DNA using EpiTect Methyl II DNA restriction kit (Qiagen, # 335452) as indicated in the manufacturer's protocol. Digested DNA was used as template for qPCR Assay using RT2 SYBR® Green qPCR Mastermixes (Qiagen, # 330509) under standard amplification conditions. Cataloged Epitect II Methyl PCR primers used were

*GSST1* (EPHS109721-1A); *MRI1* (EPHS107138-1A); *KCNH1* (EPHS101243-1A), *TMEM9* (EPHS101170-1A) and TUBA3E (EPHS108566-1A), all from Qiagen.

Statistical analysis. Statistical analysis was performed using One-way ANOVA corrected for multiple comparisons followed by the Bonferroni's post hoc test or the Student t-test (unpaired; two-tailed) with a significance of P < 0.05 (Prism Graph Pad Software) as indicated. Linear regression, Spearman's correlation and Fisher's exact probability test were calculated with Prism Graph Pad Software.

Differential methylation analysis. The Illumina custom model was applied, under the assumption that  $\beta$ -values are normally distributed among replicates. False discovery rate was computed according with the method of Benjamini-Hochberg<sup>48</sup> to correct for multiple comparisons.

Correlation of methylation values between brain and blood. We report linear regression and the Spearman correlation coefficients of  $\beta$ -methylation values in brain and blood for each individual of the PD group. We compared the individual  $\beta$  values of the top 20 probes showing concordant methylation changes in brain and blood and the 20 top probes showing differential methylation in only one tissue (selected as the 10 top probes with DM in brain and the 10 top probes with DM in blood).

We also tested the probability that increased or decreased methylation in blood was independent than increased or decreased methylation of the same probes in the brain by performing a Fisher's exact probability test on differentially methylated probes showing changes in methylation in PD brain and/or blood.

*Bootstrap analysis.* We performed bootstrap simulations to test the probability of selecting the same 124 probes from both pools of differentially methylated probes in PD brain and blood only by chance. We independently analyzed probes sets with increased and decreased methylation in PD. We generated a random sample from the 131 probes with increased methylation in brain and from the 206 that gained methylation in PD blood, and computed how many probes were present on both sets. The procedure was repeated 10 000 times. For the 10 000 iterations, most of the bootstrapped samples had a low number of co-varying probes, with n = 6 being the number of probes that reached the highest frequency (P < 0.001). Similar results were obtained when the same procedure was performed for the group of 148 probes showing decreased methylation in brain and 174 probes that lost methylation in PD blood, and testing for the probability of finding the same 61 probes in both sets.

#### Disclosure of Potential Conflicts of Interest

No potential conflicts of interest were disclosed.

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#### Author Contributions

EM contributed to study design, advised on neuropathological selection of cases included and contributed to write the paper. WD performed microarray validation experiments by qPCR. DG analyzed the clinical data and contributed to the discussion. PD designed and supervised the study; obtained DNA from postmortem samples, analyzed the data and wrote the paper.

#### Supplemental Materials

Supplemental materials may be found here: www.landesbioscience.com/journals/epigenetics/article/25865

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