# Investigation of Autosomal Genetic Sex Differences in Parkinson's Disease

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**Objective:** Parkinson's disease (PD) is a complex neurodegenerative disorder. Men are on average  $\sim$  1.5 times more likely to develop PD compared to women with European ancestry. Over the years, genomewide association studies (GWAS) have identified numerous genetic risk factors for PD, however, it is unclear whether genetics contribute to disease etiology in a sex-specific manner.

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© 2021 The Authors. *Annals of Neurology* published by Wiley Periodicals LLC on behalf of American Neurological Association. 35 This article has been contributed to by US Government employees and their work is in the public domain in the USA. This is an open access article under the terms of the Creative Commons Attribution-NonCommercial License, which permits use, distribution and reproduction in any medium, provided the original work is properly cited and is not used for commercial purposes. **Methods:** In an effort to study sex-specific genetic factors associated with PD, we explored 2 large genetic datasets from the International Parkinson's Disease Genomics Consortium and the UK Biobank consisting of 13,020 male PD cases, 7,936 paternal proxy cases, 89,660 male controls, 7,947 female PD cases, 5,473 maternal proxy cases, and 90,662 female controls. We performed GWAS meta-analyses to identify distinct patterns of genetic risk contributing to disease in male versus female PD cases. **Results:** In total, 19 genomewide significant regions were identified and no sex-specific effects were observed. A high genetic correlation between the male and female PD GWAS were identified (rg = 0.877) and heritability estimates were identical between male and female PD cases (~ 20%).

**Interpretation:** We did not detect any significant genetic differences between male or female PD cases. Our study does not support the notion that common genetic variation on the autosomes could explain the difference in prevalence of PD between males and females cases at least when considering the current sample size under study. Further studies are warranted to investigate the genetic architecture of PD explained by X and Y chromosomes and further evaluate environmental effects that could potentially contribute to PD etiology in male versus female patients.

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Parkinson's disease (PD) is an age-related, progressive neurodegenerative disorder. On average, men are ~ 1.5 times more likely to develop PD compared to women in European ancestry cohorts.<sup>1</sup> The reasons for the increased risk in men (relative to women) is not well understood. Possible explanations might include different degrees of exposure to environmental risk factors (such as pesticides and heavy metals), putative risk and protective factors (head trauma, caffeine, and urate), the influence of sex-specific hormones, differential aging, cardiovascular risk, and life expectancy, or potential genetic factors, either linked or independent of these other factors.<sup>2–5</sup>

There are also differences in the clinical presentation of PD by sex, female patients are more likely to experience dyskinesia and a slower decline in performance of activities of daily living, whereas it has been shown that male patients have a higher risk of developing cognitive impairment.<sup>6</sup> Symptoms that present into the earliest phases of PD also differ by sex; rapid eye movement (REM) sleep behavior disorder (RBD) is much more common in men, and depression and anxiety appear to be more common in women.<sup>7,8</sup> PD is a genetically complex disease, with a substantial genetic component explained by rare and common variants.<sup>9</sup> Several large case-control genomewide association studies (GWAS) have been performed, the most recent of which identified 92 risk signals across 80 loci.<sup>10,11</sup> Over the last 20 years, we have gained a great deal of insight into the genetic architecture and etiology of PD and this now serves as the basis for several therapeutic approaches. However, the interplay between sex and genetics in PD has not been broadly investigated and it is currently unknown whether the genetic risk varies between men and women. Here, we investigate whether there is a difference in the genetic architecture of autosomal risk according to genetic sex using multiple large case-control cohorts.

# Methods

# International Parkinson's Disease Genomics Consortium Data

Genotyping data, all derived from Illumina platform-based genotyping, was obtained from members of the International

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Parkinson's Disease Genomics Consortium (IPDGC), collaborators, and publicly available datasets (Supplementary Table S2). All PD cases were diagnosed using standard UK Brain bank or the Movement Disorder Society (MDS) criteria.<sup>12,13</sup> Control participants were excluded if they had any known neurological disease. All datasets underwent quality control separately, both on individuallevel data and variant-level data, before imputation was performed, as previously described.<sup>11,14</sup> Quality control steps included: relatedness filtering (PIHAT > 0.125, at the level of first cousin one random individual was removed from each pair), removal of genetic ancestry outliers departing 6 standard deviations from the European CEU/TSI HapMap3 populations, removal of samples with call rates < 95% and whose genetically determined sex from X-chromosome did not match that from clinical data, as well as samples exhibiting excess heterozygosity estimated by an F-statistic >  $\pm$  0.15. The quality control process and underlying scripts for filtering can be found at https://github.com/neurogenetics/GWAS-pipeline. Filtered genotype data was imputed using the Michigan imputation server with the Haplotype Reference Consortium reference panel r1.1 2016 under default settings with phasing using the EAGLE option.<sup>15,16</sup> For GWAS analyses, variants passing the post-imputation quality criteria of  $R^2 > 0.3$  and minor allele frequency (MAF) > 1% were included. Data were split into male and female datasets based on genetic sex. Sex specific case-control GWAS were performed using RVTESTS (version 20190205) under default settings<sup>17</sup> using logistic regression on genotype dosages adjusted for the following covariates: age at onset for cases and age of last examination for controls (for a small subset age was not available and missing values were imputed with the mean value using imputeCov), principal components (PCs) 1 to 5 to account for population stratification, and dataset origin. Age was not included in 3 datasets due to missing data (MF, VANCE) or co-linearity (FINLAND). PCs were calculated from non-imputed genotype data using FlashPCA (version 2.0).<sup>18</sup>

#### UK Biobank Data

Imputed UK Biobank (UKB) genotype data (version 3) was downloaded (April 2018) under application number 33601.<sup>19,20</sup> PD cases were identified using data fields 42032 and 42033. "Proxy" PD cases were included as part of the analyses, considering individuals who reported a parent affected with PD (paternal PD = data field 20107 and maternal PD = data field 20110) because it has been previously shown to share genetic risk with PD cases.<sup>11</sup> Controls were set as people with no report of PD, and no parent affected with PD, and with an age of recruitment over 60 (data field 21022). Covariates were obtained from the data fields: age of recruitment (data field 21022) and Townsend index (data field 189). Individuals were filtered for relatedness (PIHAT > 0.125, at the level of first cousin one random individual was removed from each pair) based on the pre-imputed genotype data using Genomewide Complex Trait Analysis (GCTA).<sup>21</sup> Only European ancestry individuals were included from data field 22006. Imputed genotypes were converted to PLINK2.pgen files using PLINK2 (version v2.00a2LM)<sup>22</sup> and filtered for missingness (removing samples with variant missingness > 0.1and MAF < 0.01), Hardy-Weinberg equilibrium of  $p \ge 1$ E-6 and imputation quality (R<sup>2</sup> > 0.8). GWAS was performed using PLINK2 logistic regression with covariates, including age of recruitment, Townsend index, and 5 PCs generated by FlashPCA to account for population substructure.<sup>18</sup> Four GWAS were performed in the UKB data (1) male PD cases versus male controls, (2) female PD cases versus female controls, (3) subjects with a father affected with PD versus controls, and (4) subjects with a mother affected with PD versus controls (Supplementary Table S2). Proxy conversion was performed as previously described.<sup>23</sup>

## **Additional Analyses**

Post GWAS quality control was applied to remove variants with an MAF < 1%, unrealistic beta values for GWAS (> 5 or < 5), and multi-allelic variants. Sex-specific meta-analyses were performed using METAL version 2018-08-28 under default settings.<sup>24</sup> Post GWAS meta-analysis, the following filtering steps were further applied: variants present in at least 13 out of the 19 datasets and displaying an I<sup>2</sup> heterogeneity value of < 80 were included. Mirror Manhattan plot generated with both filtered datasets using the Hudson package (https://github.com/anastasia-lucas/hudson). Linkage Disequilibrium Score regression (LDSC) was performed to calculate the genetic correlation between summary statistics.<sup>25</sup> To assess differences in the magnitude of associations between men's and women's heterogeneity tests were performed. Additionally, genetic heritability was calculated excluding the UKB proxies for men and women separately. All figures and statistical calculations were created and

performed using R (version 4.0.3) or Python (version 3.7). The genetic risk score was estimated using IPDGC data, and<sup>11</sup> as the reference dataset to define risk-weighted alleles. Locus numbering was obtained as previously described.<sup>26</sup> Large effect size variants from the *GBA* and *LRRK2* regions were excluded (rs76763715, rs35749011, rs34637584, and rs114138760).

# Results

#### Initial Data Overview

After quality control, we included 13,020 male PD cases, 7,936 paternal proxies, 89,660 male controls, 7,947 female PD cases, 5,473 maternal proxies, and 90,662 female controls totaling 214,698 individuals (Supplementary Table S2). The odds ratio for PD in men versus women (excluding proxies) was 1.72 (95% confidence interval [CI] = 1.66-1.78). Metaanalyses at MAF > 1%, variant present at least 13 out of the 19 datasets and displaying an I2 heterogeneity value of < 80 resulted in 7,153,507 variants passing quality control for men and 7,141,404 variants for women. No evidence of genomic inflation was observed, with Lambda 1000 and LDSC intercept values of 1.0013 and 0.9548 (SE = 0.0077) for male PD GWAS and 1.0008 and 0.9516 (SE = 0.0077) for female PD GWAS. In total, 14 and 13 genomic regions reached genomewide significance in the male and female GWAS meta-analyses respectively, of which 8 were identified in both and 11 were only genomewide significant in either GWAS. However, all these 11 genomic regions show significant signals at p > 1E-4, similar effect sizes and overlapping 95% CIs of regression coefficients (Fig 1). As expected and previously reported in the largest PD GWAS meta-analysis,11 the SNCA and MAPT loci were the main significant hits in both the male and female specific GWAS (see Fig 1), where the top SNCA variant was rs356182; (PD\_male: p = 3.47E-44, beta = 0.256, SE = 0.0184; and PD\_female: p = 1.41E-25, beta = 0.219, SE = 0.0209) and top *MAPT* variant was rs75010486; (PD\_male: p = 1.48E-32, beta = 0.244, SE = 0.0206; and PD\_female: p = 5.02E-29, beta = 0.268, SE = 0.0239). Where the SNCA locus represents the association between SNCA gene expression and PD risk and the MAPT locus the association between MAPT haplotypes H1/H2 and PD risk.

## Comparing Parkinson's Disease Risk Signals Between Men and Women

To identify potential genetic differences in risk for PD, we performed four main analyses: (1) a genomewide LDSC correlation between male and female specific summary statistics, (2) an analysis of whether the known cumulative genetic risk score was different between men and women, (3) an assessment of whether the known PD risk variants from ref. 11 were affecting men and women differently,



PD Female GWAS

FIGURE 1: Mirror Manhattan plot of male and female specific Parkinson's disease GWAS. On the top male PD GWAS, and bottom female PD GWAS. The red line indicates the -log10 p value genomewide significant threshold of 5E-8. Green dots indicate variants passing genomewide significance. Note that green highlighted signals do not represent male or female specific Parkinson's disease GWAS signals and that for each region of interest nominal significance is identified in the opposite Manhattan plot. Signals are annotated based on the closest gene from ref. 11. GWAS = genomewide association studies; PD = Parkinson's disease.

and (4) an investigation for potential novel sex-specific associations in male and female specific summary statistics. The genomewide correlation using LDSC resulted in a very high genetic correlation between the male and female PD GWASes (rg = 0.877, SE = 0.0699) which was highly significant at a p = 4.24E-36. This shows that on an autosomal genetic level, PD risk is similar between men and women as it is similar among self-reported, clinically diagnosed, and family history defined cases with genetic correlations at 84% or more as shown in ref. 11 when comparing IPDGC (clinically diagnosed) summary statistics with 23andMe data (mostly self-reported; rg = 0.85) or UK Biobank (rg = 0.84; family history defined cases). Heritability estimates (excluding UKB proxies) were similar between males and females (h2\_male = 0.2077, SE = 0.0238, and h2\_female = 0.1857, SE = 0.0304) as expected based on previous estimates.

Next, we tested whether there was a difference of cumulative genetic risk score, based on known GWAS hits and using weights from ref. 11 between male and female PD cases using the IPDGC data. Each cohort was analyzed separately and results were meta-analyzed. Meta-analysis showed that there was no difference between the cumulative genetic risk score in men and women with PD, p = 0.572 (Fig 2). Subsequently, we investigated whether any of the known GWAS risk signals were associated with



FIGURE 2: Meta-analysis of the genetic risk score versus male/ female status shows no difference between "genetic load" of Parkinson's disease associated risk. Red diamond indicates the effect estimate (odds ratio) and 95% confidence interval of the aggregate result. CI = confidence interval; GRS = genetic risk score; SNP = single nucleotide polymorphism. [Color figure can be viewed at www.annalsofneurology.org]

PD differently between male and female cases. Out of the 90 independent risk signals from the most recent PD GWAS,<sup>11</sup> 85 were present in the sex-specific GWAS



FIGURE 3: (A) Beta-beta plot of<sup>11</sup> genome wide significant risk signals. Very high correlation (Pearson correlation R2 > 0.95) is observed between effect sizes from the male and female specific GWAS. Additional details can be found in Supplementary Table S2. (B) Effect sizes of the male PD GWAS hits passing genomewide significance plotted versus matching female PD GWAS effect sizes. (C) Effect sizes of the female PD GWAS hits passing genome wide significance plotted versus matching male PD GWAS effect sizes. GWAS = genomewide association studies; PD = Parkinson's disease. [Color figure can be viewed at www. annalsofneurology.org]

summary statistics. An almost perfect correlation was observed between the effect sizes of the sex-specific GWAS for these 85 variants (Pearson correlation R2 > 0.95; Fig 3A, Supplementary Table S3). Similarly, high correlations were found comparing effect sizes between male PD GWAS and ref. 11 (> 0.98) and female PD GWAS and ref. 11 (> 0.96). Minor differences were observed in some instances. For example, the *GALC* genomic region (locus 58, rs979812) showed slight differences in magnitude of effect in men versus women; PD\_male p = 0.06462, beta = 0.031, SE = 0.0168; PD\_female p = 3.07E-06, beta = 0.0895, SE = 0.0192, and  $p_{-}$ difference = 0.0218. However, these were not significant following multiple test corrections (Supplementary Table S3).

Finally, we investigated the full summary statistics to identify potential new sex specific hits that have not been identified yet as PD GWAS risk signals. All variants passing p < 5.0E-8 from the male PD GWAS were extracted and compared to the summary statistics of the female PD GWAS and vice versa. When plotting the effect sizes of these variants, no differences were observed between male PD GWAS and female PD GWAS effect sizes of variants passing p < 5.0E-8 (see Fig 3B, C).

#### Discussion

Men are ~ 1.5 times more likely to develop PD compared to women in European ancestry. This is similar to dementia with Lewy bodies (DLB), which is also more common in men, but in contrast with Alzheimer's disease (AD) in which women are almost 1.5 to 2 times more likely to develop disease.<sup>27</sup> Where on the phenotype level slight differences are observed between men and women in PD, DLB, and AD and overall men have a faster progression/ cognitive decline and shorter lifespan after diagnosis.<sup>6,27</sup> Sex-dependent autosomal effects on clinical progression of AD have been observed<sup>28</sup> and data on sex-dependent autosomal effects for other neurodegenerative diseases is lacking. Here, we assessed whether an autosomal genetic difference explains these differences by performing GWAS using several large case-control datasets and separating these by men and women. Overall, based on the results presented here, we could not identify that autosomal genetics contributes to the difference of observed prevalence between men and women. As expected, the results from the sex-specific GWAS are highly similar to previous PD GWAS and in particular to the PD GWAS from 2011 with a very similar sample size (15 K cases).<sup>27</sup>

The question of what actually causes the difference in prevalence will need to be further evaluated. One possibility is genetic variation on the sex chromosomes. Chromosome X contains ~ 850 genes and chromosome Y ~ 70 genes and account for - 5% and - 2% of the human genome size, respectively. Although there is ongoing work in this area, thus far, no association has been found that can explain the significant over-representation of male PD patients. In the most recent X chromosome association study, one replicated genomewide signal was identified and no differences were identified between male and female effect size.<sup>28</sup> Given that chromosome Y is only present in men, it could be a good candidate for increased risk. Currently, no large genetic association studies have been performed to investigate if certain chromosome Y haplotypes are over-represented in cases versus controls. There are reports stating that certain Y chromosome genes show male-specific effects for potential dopaminergic loss.<sup>29</sup> Besides the differences in sex chromosomes in men and women, there are several other differences not directly assessed here that may likely contribute to sex differences in PD, including (1) differences in gene expression in cells and tissues on both autosomes and sex chromosomes,<sup>30,31</sup> (2) hormone production, and (3) the environment including for example smoking behavior.<sup>32</sup> All these possibilities need to be studied further with a specific focus on PD.

As for any GWAS study, there are limitations. First, due to the study design, we can only investigate common variants that are present in the imputation panels, meaning that we cannot investigate rare variants and structural variation.<sup>33,34</sup> Second, given that the majority of the data included in this study was also used in the discovery of the known 90 risk variants from ref. 11 and sex was used as a covariate in that analysis, it is not surprising that there is a high correlation of effect sizes between the male and female specific GWAS results from Figure 3A due to circularity. However, by using a more unbiased approach in Figure 3B and C no differences in effect sizes were identified for any genomewide significant hits from the sexspecific GWAS. Third, although we included a very large number of cases and controls, there could be small effect size variants that play a role in disease, not currently detected due to lack of statistical power.

Overall, by combining our manuscript with Guen et al. we provide evidence that there are no male or female specific PD GWAS hits and that the difference in prevalence of PD between men and differences females cannot be explained by common genetics when considering the current sample size under study. Further studies are warranted to investigate the genetic architecture of PD explained by the sex chromosomes and further evaluate environmental effects that could potentially contribute to PD etiology in men versus differences.

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### **Author Contributions**

C.B., M.A.N., and A.B.S. contributed to conception and design of the study. C.B., H.I., M.B.M., and M.A.-N. contributed to acquisition and analysis of data. C.B., M.A.N., A.B.S., A.J.N., and S.B.C. contributed to drafting the text or preparing the figures.

## **Potential Conflicts of Interest**

The authors declared no conflict of interest.

## Data Availability

All summary statistics are available at https://pdgenetics. org/resources. Four summary statistics tables are made available: (1) male PD GWAS (all data), (2) female PD GWAS (all data), (3) male PD GWAS (no UKB proxy data), and (4) female PD GWAS (no UKB proxy data). All code used has been made available on GitHub: https://github.com/neurogenetics/Autosomal-sexdifferences-PDv2.

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