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Sex differences in the genetic architecture of obsessive-compulsive disorder

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URLs:

- Ricopili pipeline (Schizophrenia Working Group of the Psychiatric Genomics Consortium 2014) <https://sites.google.com/a/broadinstitute.org/ricopili/>
- Assocplots (Khramtsova and Stranger 2016) <https://github.com/khramts/assocplots>
- SHAPEIT (Delaneau, Zagury, and Marchini 2013) https://mathgen.stats.ox.ac.uk/genetics_software/shapeit/shapeit.html#home
- IMPUTE2 (Howie, Marchini, and Stephens 2011) https://mathgen.stats.ox.ac.uk/impute/impute_v2.html
- PLINK2 (Purcell et al. 2007) <https://www.cog-genomics.org/plink2>
- EIGENSOFT-smartpca (Price et al. 2006) <https://data.broadinstitute.org/alkesgroup/EIGENSOFT>
- METAL (Willer, Li, and Abecasis 2010) <http://csg.sph.umich.edu/abecasis/Metal/>
- METASOFT (Han and Eskin 2011) <http://genetics.cs.ucla.edu/meta/>
- GCTA (Yang et al. 2011) <http://cnsgenomics.com/software/gcta/>
- LDSC (B. K. Bulik-Sullivan et al. 2015; B. Bulik-Sullivan et al. 2015) <https://github.com/bulik/ldsc>
- SNPsnap (Pers, Timshel, and Hirschhorn 2015) <https://data.broadinstitute.org/mpg/snpsnap/>

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Abstract

Obsessive-compulsive disorder (OCD) is a highly heritable complex phenotype that demonstrates sex differences in age of onset and clinical presentation, suggesting a possible sex difference in underlying genetic architecture. We present the first genome-wide characterization of the sex-specific genetic architecture of OCD, utilizing the largest set of OCD cases and controls available from the Psychiatric Genomics Consortium. We assessed evidence for several mechanisms that may contribute to sex differences including a sex-dependent liability threshold, the presence of individual sex-specific risk variants on the autosomes and the X chromosome, and sex-specific pleiotropic effects. Furthermore, we tested the hypothesis that genetic heterogeneity between the sexes may obscure associations in a sex-combined genome-wide association study. We observed a strong genetic correlation between male and female OCD and no evidence for a sex-dependent liability threshold model, suggesting that sex-combined analysis does not suffer from widespread loss of power due to genetic heterogeneity between the sexes. While we did not detect any significant sex-specific genome-wide SNP associations, we did identify two significant gene-based associations in females: *GRID2* and *GRP135*, which showed no association in males. We observed that the SNPs with sexually differentiated effects showed an enrichment of regulatory variants influencing expression of genes in brain and immune tissues. These findings suggest that future studies with larger sample sizes hold great promise for the identification of sex-specific genetic risk factors for OCD.

Introduction

Obsessive-compulsive disorder (OCD) displays sex differences in age of onset, progression, and symptomatology, however, the genetic basis of sex differences in OCD has not yet been comprehensively explored (Flament et al. 1990; Swedo et al. 1989; Bellodi et al. 1992; Boileau 2011). Epidemiological studies indicate a worldwide lifetime prevalence of OCD between 1 and 3% (Kessler et al. 2005; Ruscio et al. 2010; Torres and Lima 2005; Weissman et al. 1994) and while boys comprise approximately two thirds of the childhood cases of OCD, typically defined as onset before age 15 (Flament et al. 1990; Swedo et al. 1989; Bellodi et al. 1992; Boileau 2011), females predominate the late-onset cases of OCD. In addition to demonstrating a later age of onset, females with OCD have higher rates of

precipitating events which include pregnancy and childbirth (Lochner et al. 2004/3; Gerald Nestadt, Grados, and Samuels 2010). Compared to females, males with OCD report more religious, sexual, and symmetry symptoms, more alcohol dependence, and lower rates of marriage and employment. Females with OCD are more likely to be married, report more sexual abuse during childhood, often report exacerbation of symptoms in the premenstrual/menstrual period, during/shortly after pregnancy, with menopause, and tend to have more contamination and cleaning compulsions, as well as eating disorders, reviewed in Mathis et al (Mathis et al. 2011).

Although the recently-published genome-wide association studies of OCD (Mattheisen et al. 2015; Stewart et al. 2013; International Obsessive Compulsive Disorder Foundation Genetics Collaborative (IOCDF-GC) and OCD Collaborative Genetics Association Studies (OC GAS) 2017) found no genome-wide significant associations, these studies demonstrated that common variants account for a significant proportion of OCD heritability (24–32%) (Davis et al. 2013; International Obsessive Compulsive Disorder Foundation Genetics Collaborative (IOCDF-GC) and OCD Collaborative Genetics Association Studies (OC GAS) 2017). They also indicate that the strongest associated variants in OCD genome-wide association study (GWAS) are enriched for expression quantitative trait loci (eQTLs) and methylation QTLs derived from frontal lobe, cerebellum, and parietal lobe tissue (Stewart et al. 2013), demonstrating that biologically meaningful associations exist within the top ranked SNPs and that increasing sample sizes will likely identify significant common variant associations for OCD risk. In addition to increasing sample size, another approach to improve power for GWAS is to reduce genetic heterogeneity. For example, if sex significantly modifies the effect of genetic variation on the risk of OCD, then combining males and females with OCD may weaken or obscure sex-specific effects. For example, previous studies have discovered novel loci which were previously undetected due to heterogeneity between sexes (Mitra et al. 2016; Martin, Walters, Demontis, Mattheisen, Hong Lee, et al. 2017; Taylor et al. 2013; Randall et al. 2013; Liu et al. 2012; Winkler et al. 2015; Hartiala et al. 2016; Orozco et al. 2012; Zhuang and Morris 2009; Singh et al. 2016). Motivated by the sex differences in OCD, we tested the hypothesis that the genetic architecture of OCD varies between the sexes.

We first performed a sex-stratified genome-wide association meta-analysis and genotype-sex interaction meta-analysis including autosomes and the X chromosome. We then developed an approach to identify SNPs with Sexually Differentiated Effects (SDEs), and assessed whether the SDEs regulate gene expression and are enriched for associations with sexually-differentiated anthropometric traits (i.e. height, weight, body mass index, hip and waist circumference) as observed in autism spectrum disorders (Mitra et al. 2016). Third, we performed SNP-based heritability analysis to (a) assess the proportion of overall OCD heritability explained by the X chromosome, and (b) test for evidence of sexually-dependent liability threshold for OCD between males and females. An important correlate of the sex-dependent liability threshold is that the sex with the lower prevalence/milder presentation requires a higher genetic burden to become affected and therefore is more likely to have affected children, also known as the Carter effect. This has been reported for several complex traits (Kruse et al. 2012; Kantarci et al. 2006). Fourth, we performed a sex-stratified genetic correlation analysis with other traits which may play a role in OCD

development (e.g. brain volumes), are sexually-differentiated (e.g. autism, Tourette syndrome, attention deficit hyperactivity disorder, etc.), or are known to show differences in comorbidity between males and females with OCD (e.g. smoking, eating disorders, and reproductive behavior). Here, we present the first genome-wide assessment of the sex-specific genetic architecture of OCD utilizing the largest OCD dataset currently available. We also provide best practices for sex-stratified analysis which can be adopted in future studies of OCD and other phenotypes.

Methods

Datasets

The datasets (Supplementary Figure 1) used in this study comprise the OCD Psychiatric Genomics Consortium sample and are fully described in primary publications (Stewart et al. 2013; Mattheisen et al. 2015; International Obsessive Compulsive Disorder Foundation Genetics Collaborative (IOCDF-GC) and OCD Collaborative Genetics Association Studies (OC GAS) 2017). All participants over 18 and the parents of participants under 18 gave written informed consent and this work was approved by the relevant institutional review boards at all participating sites. Participants of European ancestry were selected for this study and include cases and controls from Dutch, South African, European, and Ashkenazi Jewish ancestries. Additionally, trio samples were included in the meta-analysis and consisted of proband cases and pseudo-controls. The pseudo-controls were derived from the non-transmitted parental chromosomes.

Sample and genotype level quality control and imputation

Autosomes—Genotype level data from all studies were pre-phased with SHAPEIT2 (Delaneau, Zagury, and Marchini 2013), and imputed to the 1000 Genomes Project reference panel (Phase I integrated variant set release; NCBI build 37 (hg19)) using IMPUTE2 (Howie, Marchini, and Stephens 2011), using the Ricopili pipeline (Schizophrenia Working Group of the Psychiatric Genomics Consortium 2014). Prior to imputation, SNPs with call rate < 0.98, minor allele frequency (MAF) < 0.01, case-control differential missingness > 0.02, Hardy–Weinberg equilibrium (HWE) p-values < 1e-6 for controls and < 1e-10 for cases were removed using PLINK (Purcell et al. 2007). After imputation, any SNPs with IMPUTE2 info score < 0.6 and certainty < 0.8 were removed. After splitting the datasets by sex, SNPs with MAF < 0.05 were removed from each sex, because the number of subjects carrying the minor allele was too small and could give rise to false positive association results.

At the individual level, samples were removed if the genotyping call rate was < 0.98, the absolute value of the heterozygosity F statistic was > 0.20, or there was an inconsistency between genetic sex and reported sex. Furthermore, pairwise identity by descent (IBD) analysis was used to identify cryptic relatedness between individuals, and one individual was removed at random from any pair related at the approximate level of first cousins ($\pi_{\text{hat}} > 0.2$). Principal component analyses were performed using EIGENSOFT (Price et al. 2006) separately for each sub-population, (Supplementary Methods; Supplementary Figure 2 and 3) and PC plots were inspected to ensure that for every cluster of cases there was a cluster of controls in the same PC space. PCs are visualized separately by sex in order to

ensure no subpopulation structure within each sex. After quality control, the total sample comprised 4,038 males and 5,832 females. The numbers of post-QC SNPs and individuals are listed in Supplementary Table 1.

X chromosome—X chromosome genotypes were processed separately from autosomal genotypes as additional care is required for pre-phasing, imputation, and post-imputation QC. At the genotype level, the pre-imputation QC steps for the X chromosome SNPs were the same as for the autosomes. An additional flag of -chrX was added when running SHAPEIT2 and IMPUTE2 software. Post-imputation, we employed the XWAS QC pipeline to remove variants in the pseudoautosomal regions (PARs), variants that were not in Hardy-Weinberg equilibrium in females, or variants with significantly different MAF ($p < 0.05 / \#SNPs$) and differential missingness ($P < 10^{-7}$) between males and female controls (Gao et al. 2015).

For imputation, we included those samples that passed both autosomal QC, and had a call rate > 0.98 on the X chromosome. Furthermore, because we could not use the same case/pseudo-control design for the trio data (i.e. due to lack of a non-transmitted X chromosome from the fathers of affected females), we included only the affected individuals from the trio data, ancestry-matched them to controls from the case/control dataset, and analyzed them with the case/control data. We performed PCA using EIGENSOFT and removed any trio cases without matched controls.

Genome-wide association meta-analysis

For each individual dataset, we performed sex-stratified and combined GWAS on imputed dosage files for autosomes and the X chromosome. In the sex-stratified analysis, dosages (i.e. number of chromosome copies) for the X chromosome in cases are equivalent to controls within each sex. However, in the sex-combined analysis, differences in dosage compensation between males (with one ChrX) and females (with two ChrX) should be considered. Thus, we verified that performing association analysis on ChrX dosage files produced consistent results compared with analysis of best-guess data in which ChrX was coded as 0/2 for males instead of 0/1 (--xchr-model 2 in PLINK).

In all association analyses, principal components correlated with OCD (association p-value < 0.2) were included as covariates. We used the inverse variance method implemented in METAL (Willer, Li, and Abecasis 2010) to meta-analyze summary statistics from each subpopulation and trios for sex-stratified analysis. We performed GWAS and meta-analysis on the combined male/female sample for each subpopulation to ensure that our sex-specific QC yielded results consistent with the recently reported OCD meta-GWAS using the same data (International Obsessive Compulsive Disorder Foundation Genetics Collaborative (IOCDF-GC) and OCD Collaborative Genetics Association Studies (OC GAS) 2017). The correlation calculated using LD score regression (B. K. Bulik-Sullivan et al. 2015) between our meta-analysis and the previously published meta-analysis (International Obsessive Compulsive Disorder Foundation Genetics Collaborative (IOCDF-GC) and OCD Collaborative Genetics Association Studies (OC GAS) 2017) was not significantly different

from 1 ($rg = 1.052$, $se=0.014$). Manhattan and quantile-quantile plots (Khramtsova and Stranger 2016) were used to visualize results.

Genotype-sex interaction analysis

We used PLINK to perform a genotype-sex (GxS) interaction analysis, with principal components as covariates, in each of the individual datasets. We then used METAL to meta-analyze the interaction results. A sex-stratified analysis followed by difference test (Z-score, see below) is equivalent to a formal test for genotype-sex interaction when there is no interaction between covariates and the strata, and the trait variance are equivalent in the two strata. However, different information can be gained from both types of analyses. An interaction test on a combined sample is powered to detect a difference between the sexes in genetic risk and needed to determine whether differences in effect sizes are statistically different between the sexes. On the other hand, a stratified analysis is required in order to characterize the effect size itself, and the direction of effect within each sex.

Assessment of heterogeneity from sex-stratified GWAS

We used Z-scores (correlated with Cochran's Q statistic but provides directionality of the effect, Supplementary Methods) to assess heterogeneity between males and females. To obtain a Z-score, and corresponding p-values, for each tested variant, we calculated the differences in effect sizes (beta) between the sexes weighted by the square root of the sum of beta standard errors squared (equation 1).

$$Z - score = \frac{Beta_{female} - Beta_{male}}{\sqrt{SE_{female}^2 + SE_{male}^2}} \quad \text{Equation 1}$$

We define SNPs with Sexually Differentiated Effect (SDEs) as those variants at the extreme ends of the distribution with an absolute value of the Z-score greater than 3 ($|Z\text{-score}| > 3$), which is roughly equivalent to $p < 10^{-3}$, and represents 0.3% of all tested SNPs.

Gene-based analysis, functional mapping and annotation of genome-wide association studies

We used Functional Mapping and Annotation of Genome-Wide Association Studies (FUMA) SNP2GENE web tool (Watanabe et al. 2017), to perform annotation of the male- and female-specific genome-wide associations. We used the default settings with minor modifications: the minimum p-value of the lead SNP was set at $1.0E-5$, the r^2 threshold to define the LD structure of the lead SNPs greater or equal to 0.6, the maximum p-value cutoff at 0.5, $MAF > 0.01$, 250 kb as the maximum distance between LD blocks to merge into a locus, 1000 Genomes Project Phase 3 European population as the reference panel, and variants from the reference panel were included for identification of functional variants in LD with the lead SNP. For the gene-based analysis implemented via generalized-gene set analysis of GWAS data (MAGMA) (de Leeuw et al. 2015) in FUMA, SNPs are mapped to genes if they fall within the gene start and end sites. In this analysis the mean of the χ^2 -statistic for the SNPs in a gene is calculated and the p-value is obtained from a known

approximation of the sampling distribution (Brown 1975; Hou 2005). The genome-wide significance threshold is defined as 0.05 / number of genes to which the SNPs are mapped.

Heritability estimates and genetic correlation

To calculate the sex-specific narrow-sense SNP-based heritability (h^2), (i.e., the proportion of phenotypic variation attributable to the additive effect of all SNP variants in each sex), we used two methods: 1) LD score regression (LDSC) as implemented in LDSC v1.0.0 (B. K. Bulik-Sullivan et al. 2015) and 2) restricted maximum likelihood analysis (REML) implemented in GCTA v1.24.4 (Yang et al. 2011). LDSC analysis was performed on the sex-stratified meta-analysis summary statistics from all study datasets. Meta-analyzed imputed SNPs which overlapped with a panel of high confidence HapMap SNPs were used for the LD score regression. Because our dataset is composed of European individuals, we downloaded precomputed LD scores (B. K. Bulik-Sullivan et al. 2015; B. Bulik-Sullivan et al. 2015). Using all individuals, we calculated the total and sex-stratified heritability, checked for residual population stratification (based on the LDSC intercept (B. K. Bulik-Sullivan et al. 2015)), and calculated the genetic correlation between males and females. A range of 1–3% OCD population prevalence was used to transform from the observed heritability scale to the liability scale.

For REML analysis, we used a combination of the IOCDF-GC and OCGAS European datasets plus the cases from the IOCDF-GC and OCGAS trio dataset and performed an additional PCA analysis on this combined sample to remove any outliers. Genetic relationship matrices (GRM) for autosomes and chromosome X were generated for combined and sex-stratified datasets, removing any individuals who are closely related ($IBD > 0.05$). All pruned imputed SNPs were used to determine the top 20 principal components using smartpca in EIGENSOFT (Price et al. 2006). Genomic-relatedness-based restricted maximum-likelihood (GREML) analysis was performed on the autosomes and the X chromosome (taking into account dosage compensation, Supplementary Methods) using GRMs and the top 20 ancestry covariates. The same range of prevalence estimates, as in the LDSC analysis, were used to transform heritability to the liability scale. Bivariate GREML analysis was performed to assess the genetic correlation between the sexes. To determine the proportion of the total heritability contributed by each chromosome (including the X chromosome), a separate GRM was generated for each of the 23 chromosomes. Then, all chromosomes were analyzed jointly in a single GREML analysis with 20 PCs to account for population substructure.

Enrichment of expression quantitative trait loci in brain and immune tissues among OCD-associated variants and SDEs

To assess eQTL enrichment, specifically to test for an enrichment for a gene regulatory role among top GWAS associations and SDEs, we quantified the enrichment of the number of eQTL target genes (eGenes) associated with OCD-associated SNPs. Expression quantitative trait loci (eQTL) enrichment analysis was performed on (a) SNPs nominally associated with OCD ($p < 10^{-3}$) in the combined and sex-stratified GWAS analysis, and (b) SDEs. This analysis is specifically testing the hypothesis that SNPs modestly associated with OCD (within each sex, and within the combined sample) are enriched for immune or brain eQTLs

in comparison to null sets of SNPs that are not associated with OCD. Thus, the comparison is only between SNPs associated with OCD and those not associated with OCD (but matched on genomic features).

Prior to clumping ($r^2=0.2$, 500kb window), each set of SNPs was filtered for variants with fewer than five hundred individuals present in the meta-analysis. We also report results of analyses of unfiltered SNPs (Supplementary Figure 8). eQTL annotation was performed using previously published eQTL results (Supplementary Table 2), including eQTLs derived from 10 regions of the brain and whole blood from GTEx v7 (GTEx Consortium et al. 2017), a meta-eQTL analysis of brain cortex tissue (Kim et al. 2014), as well as CD4+ T cells and CD14+ monocytes (Raj et al. 2014). To assess eQTL enrichment, 1000 randomly ascertained SNPs sets were generated using SNPsnap (Pers, Timshel, and Hirschhorn 2015), sampled without replacement (replacement is allowed only when not enough matched SNPs are available) from the European catalogue of 1000 Genomes SNPs, and matched for minor allele frequency ($\pm 5\%$), gene density ($\pm 50\%$), distance to nearest gene (within a 1000kb window), and LD buddies ($\pm 50\%$) at $r^2=0.8$.

SNPs in the OCD-associated set and the null matched SNP sets were annotated both with *cis*-eQTL status and with the genes they regulate (i.e., eGenes) in brain and immune tissues. The enrichment p-value was calculated as the proportion of randomized sets in which the number of eGenes matched or exceeded the observed count among trait-associated SNPs. If multiple variants implicated the same eGene in a tissue or cell type, the eGene was counted only once. This strategy is different from counting individual eQTLs variants, as was done for the previous OCD GWAS (Stewart et al. 2013), where multiple SNPs may be regulating the same gene, while here all eQTLs targeting the same gene are counted only once. We also performed “pan-tissue” eQTL eGene analysis by combining the eQTL results from all the brain tissue subtypes and all the immune tissue and cell subtypes. If an eGene was present in more than one tissue, it was counted only once. To exclude the possibility of eQTL enrichment overestimation due to the gene-rich MHC region, we performed eQTL enrichment analysis both including and excluding SNPs in the HLA region. The enrichment was considered significant if the empirical p-value exceeded Bonferroni multiple testing correction threshold $p<0.0036$ (i.e. $0.05/14$ tissues).

Enrichment of OCD-associated SNPs among anthropometric trait SDEs

We tested for enrichment of anthropometric trait SDEs (ASDEs) among SNPs nominally associated with OCD ($p<10^{-3}$) in (a) the combined male/female analysis, (b) the sex-stratified analyses, and (c) the OCD SDEs. ASDEs were defined using the approach described in (Mitra et al. 2016) (Z -score $p\leq 10^{-3}$) for several anthropomorphic traits from the GIANT consortium (Randall et al. 2013): weight, height, body mass index (BMI), hip circumference (HIP), HIP adjusted for BMI (HIPadjBMI), waist circumference (WC), WC adjusted for BMI (WCadjBMI), waist-to-hip ratio (WHR), and WHR adjusted for BMI (WHRadjBMI) resulting in a total of 12,006 unique ASDEs identified across GIANT phenotypes. We determined the overlap of ASDEs with each OCD subset (Supplementary Figure 9), as well as with 1000 matching SNP sets for each of the OCD subsets. An empirical enrichment p-value was calculated as the proportion of null randomized sets in

which the overlap matched or exceeded the observed overlap using the OCD associated SNPs.

Sex-stratified genetic correlation analyses

Genetic correlation analysis of OCD with thirty-one phenotypes of interest was performed for the combined OCD sample and sex-stratified OCD samples using LD score regression (B. K. Bulik-Sullivan et al. 2015). Sex-stratified summary statistics for the following eight phenotypes were obtained (Supplementary Table 6): attention-deficit hyperactivity disorder (Martin, Walters, Demontis, Mattheisen, Lee, et al. 2017), post-traumatic stress disorder (Duncan et al. 2017), reproductive behavior (Barban et al. 2016), insomnia (Hammerschlag et al. 2017), educational attainment (Okbay, Beauchamp, et al. 2016), and alcohol consumption (Clarke et al. 2017; Schumann et al. 2016). In the absence of available sex-stratified summary statistics, sex-combined results were obtained for thirty-one phenotypes (Supplementary Table 7): Tourette Syndrome (Scharf et al. 2013; Yu et al. 2015), obsessive-compulsive symptoms (den Braber et al. 2016), post-traumatic stress disorder (Duncan et al. 2017), attention deficit hyperactivity disorder (Neale et al. 2010), autism (unpublished, available via Psychiatric Genomics Consortium), bipolar disorder (Psychiatric GWAS Consortium Bipolar Disorder Working Group 2011), major depressive disorder (Major Depressive Disorder Working Group of the Psychiatric GWAS Consortium et al. 2013), schizophrenia (Schizophrenia Working Group of the Psychiatric Genomics Consortium 2014), anxiety disorders (Otowa et al. 2016), depressive symptoms, neuroticism, subjective well-being (Okbay, Baselmans, et al. 2016), anorexia (Boraska et al. 2014), body mass index (Locke et al. 2015), tobacco usage (Tobacco and Genetics Consortium 2010), reproductive behavior (Barban et al. 2016) and structural brain measures (accumbens, amygdala, pallidum, caudate, thalamus, putamen volumes) (Hibar et al. 2015), hippocampal volume (Hibar et al. 2017), intracranial volume (Adams et al. 2016), insomnia (Hammerschlag et al. 2017), educational attainment (Okbay, Beauchamp, et al. 2016), and alcohol consumption (Clarke et al. 2017; Schumann et al. 2016). We identified high confidence HapMap SNPs (for which the LD scores have been precomputed) present in the OCD summary statistics and each of the other summary statistics. For continuous traits (e.g. cognitive performance, brain structure volumes) no sample or population prevalence was specified. For binary traits the sample prevalence was calculated based on the reported number of cases in the sample, while the population prevalence was obtained from the literature (Supplementary Table 7).

Results

Sex-stratified genome-wide association and genotype-sex interaction analyses

Genomic control lambda (λ_{GC}) revealed no significant evidence of population stratification in the male-specific ($\lambda_{GC}=1.019$), the female-specific ($\lambda_{GC}=1.026$), or the combined ($\lambda_{GC}=1.051$) meta-analyses. The intercepts estimated by LD score regression of 1.002, 0.991, 1.005 for sex-combined, female-only, and male-only, respectively, suggested that the mild inflation observed on the quantile-quantile plots (λ_{GC}) was not due to population stratification but rather to polygenic effects. The Manhattan and quantile-quantile plots (Figure 1 A-B) demonstrated no genome-wide significant associations in either males or females. There was little overlap in the top signals across sexes as illustrated by the lack of

points along a diagonal line from the left bottom corner to the right upper corner of Figure 1C (top ten associations, Table 1). This visualization indicates that there are no variants which strongly associate ($-\log_{10}(p\text{-value}) > 3$) with OCD in both sexes. In fact, the strongest associations in one sex, have very low $-\log_{10}(p\text{-value})$ in the opposite sex. Gene-based tests computed by MAGMA revealed two genome-wide significant genes in the female analysis: GRID2 (pFEMALE = 1.07E-07, pMALE = 7.23E-01) and GPR135 (pFEMALE = 1.55E-06, pMALE = 7.04E-01) which were not significant in males (Supplementary Figure 4). All other tests implemented in FUMA, including MAGMA gene-set analysis, and tissue expression analysis did not result in any significant findings for either sex.

The QQ plots (Supplementary Figure 5 A-B) of Z-score p-values indicated no significant SDEs (top ten SDEs, Table 2), and that the difference in effect size for SDEs was not driven by minor allele frequency (MAF) differences between sexes (Supplementary Figure 6). The MAF distributions for SDEs and all tested SNPs were identical, and sexually-differentiated loci were distributed across the genome proportional to chromosome length (Supplementary Figure 6D). P-values from a genotype-sex interaction test (Supplementary Figure 5 C-D) were highly correlated with Z-score p-values from the sex-stratified analysis (autosomal SNPs Pearson's $r=0.65$, $p < 2.2e-16$, X chromosome SNPs Pearson's $r=0.71$, $p < 2.2e-16$). Furthermore, GWAS results in the combined sample with or without sex as a covariate were highly correlated (LDSC $r_g=0.999$, $se=0.001$).

Genetic correlation for OCD is high between males and females

For highly polygenic traits, individual genetic variants, including the most significantly associated variants, typically explain only a small fraction of a trait's phenotypic variance. To characterize the sex-specific genetic architecture of OCD, we explored sub-threshold associations and their contribution to OCD heritability (h^2).

The difference in heritability estimates (Table 3) between males ($h^2_M=0.131$, $SE = 0.097$) and females ($h^2_F=0.296$, $SE = 0.079$), as determined by LDSC regression, was not statistically significant, and the genetic correlation between the sexes was substantial ($r_g = 1.043$, $SE = 0.509$, $p=0.041$). The restricted maximum likelihood analysis (REML) estimates of heritability were almost identical between males ($h^2_M=0.232$, $se=0.072$, $p=0.001$) and females ($h^2_F=0.240$, $se=0.057$, $p=1.07e-05$), and to the combined estimate ($h^2=0.238$, $se=0.033$, $p=8.621e-14$). The REML genetic correlation between males and females was 1.00 ($se=0.27$). The observed patterns were also robust across population prevalence rates (Supplementary Table 3).

X chromosome contributes to the polygenic architecture of OCD in both sexes

One of the mechanisms by which sex differences in OCD could arise is through genetic risk deriving from the sex chromosomes. We observed no significant associations on the X chromosome in either the combined or sex-stratified analyses. A QQ-plot indicated that there was no significant SDEs on the X chromosome (Supplementary Figure 5). Using REML, we estimated the X chromosome (1.6% of total SNPs) heritability as $h^2_X=0.010$ ($se=0.005$, $p=0.006$), which comprised 3.8% of total OCD heritability, and was consistent with expectation (Supplementary Figure 7). When analyzed in each sex separately, X

chromosome heritability was not statistically different between females ($h^2_{FX}=0.014$, $se=0.008$, $p=0.027$) and males ($h^2_{MX}=0.028$, $se=0.013$, $p=0.010$) at 2.5% OCD prevalence. Results were again robust to estimates derived using a range of OCD prevalence (Supplementary Table 3).

eQTL enrichment observed among SDEs and strongest associations from sex-stratified GWAS

To investigate the functional effects of top associations ($p<10^{-3}$) from the sex-stratified GWAS analysis and SDEs, we annotated each SNP as to whether it was an expression quantitative trait locus (eQTL) in brain or immune tissues. We tested for enrichment of eQTLs derived from brain tissues because brain is the primary tissue of interest, but also eQTLs derived from immune cells because the immune system has been previously implicated in several neuropsychiatric and neurodegenerative traits (Schizophrenia Working Group of the Psychiatric Genomics Consortium 2014; Marsh et al. 2016; Heneka, Golenbock, and Latz 2015; Furtado and Katzman 2015a), including OCD (Furtado and Katzman 2015b; Murphy, Sajid, and Goodman 2006)

SDEs showed a significant enrichment for eQTLs from CD4+ T cells ($p<0.001$), the combination of immune tissues ($p<0.002$), and combined brain tissues excluding the functionally distinct cerebellum ($p=0.001$) (Figure 2, Supplementary Table 4). 188 eGenes were implicated by brain eQTLs and 198 by immune eQTLs, with 48 eGenes deriving from both tissues (Supplementary Table 5). Including HLA SNPs did not significantly affect the results. Consistent with the FUMA results presented above, we did not detect significant enrichments in the combined or sex-stratified analysis.

Little overlap of OCD SDEs and anthropometric traits SDEs

Previous work has revealed enrichment of anthropometric traits SDEs (ASDEs) among top autism (ASD), bipolar disorder (BIP) (Mitra et al. 2016), and endometriosis (Rahmioglu et al. 2015) associated genetic variants, suggesting that the same mechanisms acting on secondary sex characteristic differences later in life may also contribute to sex differences in other complex traits, including neuropsychiatric phenotypes, via pleiotropic effects. There was little overlap and no significant enrichment ($p=0.14$) for ASDEs among the clumped top combined, female-specific, male-specific GWAS associations, or OCD SDEs (Supplementary Figure 9).

Males and females demonstrate similar levels of genetic correlation between OCD and other complex traits

As the lower bounds on the genetic correlation estimate of OCD between sexes ranged from 0.49–0.73, we explored whether males and females demonstrate differential genetic correlations between OCD and 30 traits (Supplementary Table 7) which may play a role in OCD development. Our analysis was limited by availability of combined male and female summary statistics for the majority of the traits we tested in the correlation. When available, we have used sex-stratified summary statistics to perform genetic correlation analysis between traits within each sex and assessed differences between sexes. The traits chosen for analysis included (1) neuropsychiatric phenotypes and behavioral traits (many of which

exhibit sexually-differentiated characteristics), (2) traits which overlap with known sexually-differentiated clinical symptoms in OCD (e.g. smoking, eating disorders-anorexia, and body mass index), (3) brain structure volumes, and (4) reproductive behavior (age at first birth and number of children ever born).

Using sex-stratified summary statistics for OCD and traits listed in Supplementary Table 6, we performed cross-trait genetic correlations within each sex (i.e. R_g between male OCD with male ADHD and female OCD with female ADHD). There were no significant cross-trait genetic correlations in either sex after multiple testing correction nor did the cross-trait correlations differ significantly between males and females (Supplementary Table 6), suggesting that sex stratified analyses are likely still underpowered. To increase the power of this analysis, next, we used sex-combined summary statistics for several complex traits (Supplementary Table 7) and performed cross-trait correlation analysis with sex-stratified OCD summary statistics. Several traits (bipolar disorder, schizophrenia, and neuroticism) exhibited a significant genetic correlation with female OCD, but not male OCD, again, possibly influenced by sample size (Supplementary Table 7). Again, the genetic correlations for OCD with other traits did not differ significantly between males and females.

A genetic correlation analysis using sex-combined summary statistics for OCD and other traits, revealed several significant cross-trait correlations, indicating that a larger sample size results in more precise estimates of the genetic correlation. We observed novel significant genetic correlations between the sex-combined OCD sample and the sex-combined summary statistics from age at first birth ($r_g=0.37$, $se=0.07$, $4.83e-07$), number of children ever born ($r_g=-0.35$, $se=0.09$, $p=6.66e-05$), and replicated previously published results (Brainstorm Consortium et al. 2018; Davis et al. 2013; Yu et al. 2015).

Discussion

Obsessive-compulsive disorder is one of many neuropsychiatric traits exhibiting sex differences in both age of onset and presentation of symptoms. Gene-based analysis identified two genes (GRID2 and GPR135) with female-specific associations that were not present in males, however, at the level of individual loci, no genome-wide significant associations were detected in either the sex-stratified GWAS or the genotype-sex interaction analysis. The genome-wide genetic correlation for OCD between males and females was not significantly different from 1 and OCD heritability estimates were not significantly different between the sexes. Additionally, we observed no significant differences in the cross-trait genetic correlations between males and females which is currently best explained by the absence of ubiquitous genetic architecture differences between male and female OCD, as well as small sample sizes which negatively impact on the ability to detect smaller differences between the sexes. Finally, partitioned heritability analysis indicated that the X chromosome contributed to the polygenic liability of OCD, underscoring the importance of including the X chromosome in GWAS of OCD.

The GRID2 gene is part of the glutamatergic signaling system (Pittenger, Bloch, and Williams 2011) which is thought to be important in OCD and is expressed in the brain regions which have been implicated in OCD (cerebellum, caudate, putamen, nucleus

accumbens, and the anterior cingulate cortex) (Graybiel and Rauch 2000). Less is known about GPR135, however, results from the GTEx portal (<https://gtexportal.org>) indicate that it is also expressed in brain. Taken together, these results indicate that significant sex-specific effects for OCD likely exist but will be challenging to detect given their modest effect sizes and the sample size required to detect statistically robust genotype-sex interactions. Encouragingly, significant sex-stratified associations have been identified in studies of ASD and ADHD, demonstrating the value of increasing sample size for the study of sexually-differentiated genetic effects (Mitra et al. 2016; Martin, Walters, Demontis, Mattheisen, Lee, et al. 2017).

Furthermore, we observed that SDEs, SNPs with the greatest heterogeneity in effect size between males and females were enriched for gene regulatory function (eQTLs) in brain and immune tissues, implicating these tissues in sexual-differentiation of OCD. The enrichment of immune eQTLs among SDEs is consistent with both the known role of the immune system in several neuropsychiatric traits (Schizophrenia Working Group of the Psychiatric Genomics Consortium 2014; Furtado and Katzman 2015a, [b] 2015; Murphy, Sajid, and Goodman 2006), and the observed sex differences in immune function (Klein and Flanagan 2016). Moreover, a recent whole-exome sequencing study found that OCD probands have a higher rate of *de novo* nonsynonymous single-nucleotide variants in genes enriched for neurodevelopmental and immunological processes (Cappi et al. 2016). Though specific mechanisms remain unknown, these studies provide new evidence for an old hypothesis linking the immune system with compulsive behavior and OCD (Marazziti et al. 1999; Kawikova et al. 2007; Murphy, Sajid, and Goodman 2006; Slattery et al. 2004; Miguel et al. 1995; Swedo et al. 1998; Murphy et al. 2012; Snider and Swedo 2004; Swedo et al. 2012; Leonard et al. 1992; Carapetis and Currie 1999).

Limitations for this study include sample size, and ascertainment strategies that may bias towards earlier age of onset which could result in uneven representation of disease subclasses among males and females. For example, early-onset OCD is reportedly slightly more heritable than adult-onset (Davis et al. 2013; G. Nestadt et al. 2000; van Grootheest et al. 2005). Thus, uneven representation of males and females in the early- and adult-onset OCD groups could confound heritability if estimates are influenced by both sex and age-at-onset. Age-of-onset information is incomplete in many of the historical sample collections that have been included in this meta-analysis. The lack of detailed clinical data limits our ability to address many important questions related to symptom type, symptom severity, and age of onset. These limitations underscore the need for larger OCD datasets phenotyped in greater detail to delve deeper into both genetic and clinical sex differences observed in OCD.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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References:

- Adams Hieab H. H., Hibar Derrek P., Chouraki Vincent, Stein Jason L., Nyquist Paul A., Rentería Miguel E., Trompet Stella, et al. 2016 “Novel Genetic Loci Underlying Human Intracranial Volume Identified through Genome-Wide Association.” *Nature Neuroscience* 19 (12): 1569–82. [PubMed: 27694991]
- Barban Nicola, Jansen Rick, Ronald de Vlaming Ahmad Vaez, Mandemakers Jornt J., Tropf Felix C., Shen Xia, et al. 2016 “Genome-Wide Analysis Identifies 12 Loci Influencing Human Reproductive Behavior.” *Nature Genetics* 48 (12): 1462–72. [PubMed: 27798627]
- Bellodi L, Sciuto G, Diaferia G, Ronchi P, and Smeraldi E. 1992 “Psychiatric Disorders in the Families of Patients with Obsessive-Compulsive Disorder.” *Psychiatry Research* 42 (2): 111–20. [PubMed: 1631248]
- Boileau Bernard. 2011 “A Review of Obsessive-Compulsive Disorder in Children and Adolescents.” *Dialogues in Clinical Neuroscience* 13 (4): 401–11. [PubMed: 22275846]
- Boraska V, Franklin CS, Floyd JAB, Thornton LM, Huckins LM, Southam L, Rayner NW, et al. 2014 “A Genome-Wide Association Study of Anorexia Nervosa.” *Molecular Psychiatry* 19 (10): 1085–94. [PubMed: 24514567]
- den Braber A, Zilhão NR, Fedko IO, Hottenga J-J, Pool R, Smit DJA, Cath DC, and Boomsma DI. 2016 “Obsessive-compulsive Symptoms in a Large Population-Based Twin-Family Sample Are Predicted by Clinically Based Polygenic Scores and by Genome-Wide SNPs.” *Translational Psychiatry* 6 (2): e731. [PubMed: 26859814]
- Consortium Brainstorm, Anttila Verner, Brendan Bulik-Sullivan Hilary K. Finucane, Walters Raymond K., Bras Jose, Duncan Laramie, et al. 2018 “Analysis of Shared Heritability in Common Disorders of the Brain.” *Science* 360 (6395). 10.1126/science.aap8757.
- Brown Morton B. 1975 “400: A Method for Combining Non-Independent, One-Sided Tests of Significance.” *Biometrics* 31 (4): 987–92.
- Bulik-Sullivan Brendan, Finucane Hilary K., Anttila Verner, Gusev Alexander, Day Felix R., Loh Po-Ru, Consortium ReproGen, et al. 2015 “An Atlas of Genetic Correlations across Human Diseases and Traits.” *Nature Genetics* 47 (11): 1236–41. [PubMed: 26414676]
- Bulik-Sullivan Brendan K., Loh Po-Ru, Finucane Hilary K., Ripke Stephan, Yang Jian, Schizophrenia Working Group of the Psychiatric Genomics Consortium, Patterson Nick, Daly Mark J., Price Alkes L., and Neale Benjamin M.. 2015 “LD Score Regression Distinguishes Confounding from

Polygenicity in Genome-Wide Association Studies.” *Nature Genetics* 47 (3): 291–95. [PubMed: 25642630]

- Cappi C, Brentani H, Lima L, Sanders SJ, Zai G, Diniz BJ, Reis VNS, et al. 2016 “Whole-Exome Sequencing in Obsessive-Compulsive Disorder Identifies Rare Mutations in Immunological and Neurodevelopmental Pathways.” *Translational Psychiatry* 6 (3): e764. [PubMed: 27023170]
- Carapetis JR, and Currie BJ. 1999 “Rheumatic Chorea in Northern Australia: A Clinical and Epidemiological Study.” *Archives of Disease in Childhood* 80 (4): 353–58. [PubMed: 10086943]
- Clarke T-K, Adams MJ, Davies G, Howard DM, Hall LS, Padmanabhan S, Murray AD, et al. 2017 “Genome-Wide Association Study of Alcohol Consumption and Genetic Overlap with Other Health-Related Traits in UK Biobank (N=112 117).” *Molecular Psychiatry* 22 (10): 1376–84. [PubMed: 28937693]
- Davis Lea K., Yu Dongmei, Keenan Clare L., Gamazon Eric R., Konkashbaev Anuar I., Derks Eske M., Neale Benjamin M., et al. 2013 “Partitioning the Heritability of Tourette Syndrome and Obsessive Compulsive Disorder Reveals Differences in Genetic Architecture.” *PLoS Genetics* 9 (10): e1003864. [PubMed: 24204291]
- Delaneau Olivier, Zagury Jean-Francois, and Marchini Jonathan. 2013 “Improved Whole-Chromosome Phasing for Disease and Population Genetic Studies.” *Nature Methods* 10 (1): 5–6. [PubMed: 23269371]
- Duncan LE, Ratanatharathorn A, Aiello AE, Almli LM, Amstadter AB, Ashley-Koch AE, Baker DG, et al. 2017 “Largest GWAS of PTSD (N=20 070) Yields Genetic Overlap with Schizophrenia and Sex Differences in Heritability.” *Molecular Psychiatry*, 4 10.1038/mp.2017.77.
- Flament MF, Koby E, Rapoport JL, Berg CJ, Zahn T, Cox C, Denckla M, and Lenane M. 1990 “Childhood Obsessive-Compulsive Disorder: A Prospective Follow-up Study.” *Journal of Child Psychology and Psychiatry, and Allied Disciplines* 31 (3): 363–80.
- Furtado Melissa, and Katzman Martin A.. 2015a “Examining the Role of Neuroinflammation in Major Depression.” *Psychiatry Research* 229 (1–2): 27–36. [PubMed: 26187338]
- . 2015b “Neuroinflammatory Pathways in Anxiety, Posttraumatic Stress, and Obsessive Compulsive Disorders.” *Psychiatry Research* 229 (1–2): 37–48. [PubMed: 26296951]
- Gao Feng, Chang Diana, Biddanda Arjun, Ma Li, Guo Yingjie, Zhou Zilu, and Keinan Alon. 2015 “XWAS: A Software Toolset for Genetic Data Analysis and Association Studies of the X Chromosome.” *The Journal of Heredity* 106 (5): 666–71. [PubMed: 26268243]
- Graybiel AM, and Rauch SL. 2000 “Toward a Neurobiology of Obsessive-Compulsive Disorder.” *Neuron* 28 (2): 343–47. [PubMed: 11144344]
- Groothest, van Daniël S., Cath Daniëlle C., Beekman Aartjan T., and Boomsma Dorret I. 2005 “Twin Studies on Obsessive–Compulsive Disorder: A Review.” *Twin Research and Human Genetics: The Official Journal of the International Society for Twin Studies* 8 (5): 450–58. [PubMed: 16212834]
- GTEX Consortium, Laboratory, Data Analysis & Coordinating Center (LDACC)—Analysis Working Group, Statistical Methods groups—Analysis Working Group, Enhancing GTEX (eGTEX) groups, NIH Common Fund, NIH/NCI, NIH/NHGRI, et al. 2017 “Genetic Effects on Gene Expression across Human Tissues.” *Nature* 550 (7675): 204–13. [PubMed: 29022597]
- Hammerschlag Anke R., Stringer Sven, de Leeuw Christiaan A., Sniekers Suzanne, Taskesen Erdogan, Watanabe Kyoko, Blanken Tessa F., et al. 2017 “Genome-Wide Association Analysis of Insomnia Complaints Identifies Risk Genes and Genetic Overlap with Psychiatric and Metabolic Traits.” *Nature Genetics* 49 (11): 1584–92. [PubMed: 28604731]
- Han Buhm, and Eskin Eleazar. 2011 “Random-Effects Model Aimed at Discovering Associations in Meta-Analysis of Genome-Wide Association Studies.” *American Journal of Human Genetics* 88 (5): 586–98. [PubMed: 21565292]
- Hartiala Jaana A., Wilson Tang WH, Wang Zeneng, Crow Amanda L., Stewart Alexandre F. R., Roberts Robert, McPherson Ruth, et al. 2016 “Genome-Wide Association Study and Targeted Metabolomics Identifies Sex-Specific Association of CPS1 with Coronary Artery Disease.” *Nature Communications* 7 (1): 10558.
- Heneka Michael T., Golenbock Douglas T., and Latz Eicke. 2015 “Innate Immunity in Alzheimer’s Disease.” *Nature Immunology* 16 (3): 229–36. [PubMed: 25689443]

- Hibar Derrek P., Adams Hieab H. H., Jahanshad Neda, Chauhan Ganesh, Stein Jason L., Hofer Edith, Renteria Miguel E., et al. 2017 “Novel Genetic Loci Associated with Hippocampal Volume.” *Nature Communications* 8 (1): 13624.
- Hibar Derrek P., Stein Jason L., Renteria Miguel E., Alejandro Arias-Vasquez Sylvane Desrivieres, Jahanshad Neda, Toro Roberto, et al. 2015 “Common Genetic Variants Influence Human Subcortical Brain Structures.” *Nature* 520 (7546): 224–29. [PubMed: 25607358]
- Hou Chia-Ding. 2005 “A Simple Approximation for the Distribution of the Weighted Combination of Non-Independent or Independent Probabilities.” *Statistics & Probability Letters* 73 (2): 179–87.
- Howie Bryan, Marchini Jonathan, and Stephens Matthew. 2011 “Genotype Imputation with Thousands of Genomes.” *G3* 1 (6): 457–70. [PubMed: 22384356]
- International Obsessive Compulsive Disorder Foundation Genetics Collaborative (IOCDF-GC) and OCD Collaborative Genetics Association Studies (OCGAS). 2017 “Revealing the Complex Genetic Architecture of Obsessive-Compulsive Disorder Using Meta-Analysis.” *Molecular Psychiatry*, 8 10.1038/mp.2017.154.
- Kantarci OH, Barcellos LF, Atkinson EJ, Ramsay PP, Lincoln R, Achenbach SJ, De Andrade M, Hauser SL, and Weinshenker BG. 2006 “Men Transmit MS More Often to Their Children vs Women: The Carter Effect.” *Neurology* 67 (2): 305–10. [PubMed: 16864824]
- Kawikova Ivana, Leckman James F., Kronig Holger, Katsovich Lily, Bessen Debra E., Ghebremichael Musie, and Bothwell Alfred L. M.. 2007 “Decreased Numbers of Regulatory T Cells Suggest Impaired Immune Tolerance in Children with Tourette Syndrome: A Preliminary Study.” *Biological Psychiatry* 61 (3): 273–78. [PubMed: 16996487]
- Kessler Ronald C., Wai Tat Chiu Olga Demler, Merikangas Kathleen R., and Walters Ellen E.. 2005 “Prevalence, Severity, and Comorbidity of 12-Month DSM-IV Disorders in the National Comorbidity Survey Replication.” *Archives of General Psychiatry* 62 (6): 617–27. [PubMed: 15939839]
- Khramtsova Ekaterina A., and Stranger Barbara E.. 2016 “Assocplots: A Python Package for Static and Interactive Visualization of Multiple-Group GWAS Results.” *Bioinformatics*, 10 10.1093/bioinformatics/btw641.
- Kim Y, Xia K, Tao R, Giusti-Rodriguez P, Vladimirov V, van den Oord E, and Sullivan PF. 2014 “A Meta-Analysis of Gene Expression Quantitative Trait Loci in Brain.” *Translational Psychiatry* 4 (10): e459. [PubMed: 25290266]
- Klein Sabra L., and Flanagan Katie L.. 2016 “Sex Differences in Immune Responses.” *Nature Reviews. Immunology* 16 (10): 626–38.
- Kruse Lisa M., Buchan Jillian G., Gurnett Christina A., and Dobbs Matthew B.. 2012 “Polygenic Threshold Model with Sex Dimorphism in Adolescent Idiopathic Scoliosis: The Carter Effect.” *The Journal of Bone and Joint Surgery. American Volume* 94 (16): 1485–91. [PubMed: 22992817]
- de Leeuw Christiaan A., Mooij Joris M., Heskes Tom, and Posthuma Danielle. 2015 “MAGMA: Generalized Gene-Set Analysis of GWAS Data.” *PLoS Computational Biology* 11 (4): e1004219. [PubMed: 25885710]
- Leonard HL, Swedo SE, Rapoport JL, Rickler KC, Topol D, Lee S, and Rettew D. 1992 “Tourette Syndrome and Obsessive-Compulsive Disorder.” *Advances in Neurology* 58: 83–93. [PubMed: 1414648]
- Liu Linda Y., Schaub Marc A., Sirota Marina, and Butte Atul J.. 2012 “Sex Differences in Disease Risk from Reported Genome-Wide Association Study Findings.” *Human Genetics* 131 (3): 353–64. [PubMed: 21858542]
- Lochner Christine, Hemmings Sian M. J., Kinnear Craig J., Moolman-Smook Johanna C., Corfield Valerie A., Knowles James A., Niehaus Dana J. H., and Stein Dan J.. 2004/3 “Gender in Obsessive-compulsive Disorder: Clinical and Genetic Findings.” *European Neuropsychopharmacology: The Journal of the European College of Neuropsychopharmacology* 14 (2): 105–13. [PubMed: 15013025]
- Locke AE, Kahali B, Berndt SI, Justice AE, Pers TH, Day FR, Powell C, et al. 2015 “Genetic Studies of Body Mass Index Yield New Insights for Obesity Biology.” *Nature* 518 (7538): 197–206. [PubMed: 25673413]

- Major Depressive Disorder Working Group of the Psychiatric GWAS Consortium, Ripke Stephan, Wray Naomi R., Lewis Cathryn M., Hamilton Steven P., Weissman Myrna M., Breen Gerome, et al. 2013 “A Mega-Analysis of Genome-Wide Association Studies for Major Depressive Disorder.” *Molecular Psychiatry* 18 (4): 497–511. [PubMed: 22472876]
- Marazziti D, Presta S, Pfanner C, Gemignani A, Rossi A, Sbrana S, Rocchi V, Ambrogi F, and Cassano GB. 1999 “Immunological Alterations in Adult Obsessive-Compulsive Disorder.” *Biological Psychiatry* 46 (6): 810–14. [PubMed: 10494449]
- Marsh Samuel E., Abud Edsel M., Lakatos Anita, Karimzadeh Alborz, Yeung Stephen T., Davtyan Hayk, Fote Gianna M., et al. 2016 “The Adaptive Immune System Restrains Alzheimer’s Disease Pathogenesis by Modulating Microglial Function.” *Proceedings of the National Academy of Sciences of the United States of America* 113 (9): E1316–25. [PubMed: 26884167]
- Martin Joanna, Walters Raymond K., Demontis Ditte, Mattheisen Manuel, Lee S. Hong, Robinson Elise, Brikell Isabell, et al. 2017 “A Genetic Investigation of Sex Bias in the Prevalence of Attention Deficit Hyperactivity Disorder.” *bioRxiv*. 10.1101/154088.
- Martin Joanna, Walters Raymond K., Demontis Ditte, Mattheisen Manuel, Lee S. Hong, Robinson Elise, Brikell Isabell, et al. 2017 “A Genetic Investigation of Sex Bias in the Prevalence of Attention-Deficit/Hyperactivity Disorder.” *Biological Psychiatry*, 12 10.1016/j.biopsych.2017.11.026.
- de Mathis Maria Alice, de Alvarenga Pedro, Funaro Guilherme, Torresan Ricardo Cezar, Moraes Ivanil, Torres Albina Rodrigues, Zilberman Monica L., and Hounie Ana Gabriela. 2011 “Gender Differences in Obsessive-Compulsive Disorder: A Literature Review.” *Revista Brasileira de Psiquiatria* 33 (4): 390–99. [PubMed: 22189930]
- Mattheisen M, Samuels JF, Wang Y, Greenberg BD, Fyer AJ, McCracken JT, Geller DA, et al. 2015 “Genome-Wide Association Study in Obsessive-Compulsive Disorder: Results from the OCGAS.” *Molecular Psychiatry* 20 (3): 337–44. [PubMed: 24821223]
- Miguel EC, Stein MC, Rauch SL, O’Sullivan RL, Stern TA, and Jenike MA. 1995 “Obsessive-Compulsive Disorder in Patients with Multiple Sclerosis.” *The Journal of Neuropsychiatry and Clinical Neurosciences* 7 (4): 507–10. [PubMed: 8555756]
- Mitra Ileana, Tsang Kathryn, Christine Ladd-Acosta Lisa A. Croen, Aldinger Kimberly A., Hendren Robert L., Traglia Michela, et al. 2016 “Pleiotropic Mechanisms Indicated for Sex Differences in Autism.” *PLoS Genetics* 12 (11): e1006425. [PubMed: 27846226]
- Murphy Tanya K., Sajid Muhammad W., and Goodman Wayne K.. 2006 “Immunology of Obsessive-Compulsive Disorder.” *The Psychiatric Clinics of North America* 29 (2): 445–69. [PubMed: 16650717]
- Murphy Tanya K., Storch Eric A., Lewin Adam B., Edge Paula J., and Goodman Wayne K.. 2012 “Clinical Factors Associated with Pediatric Autoimmune Neuropsychiatric Disorders Associated with Streptococcal Infections.” *The Journal of Pediatrics* 160 (2): 314–19. [PubMed: 21868033]
- Neale Benjamin M., Medland Sarah E., Ripke Stephan, Asherson Philip, Franke Barbara, Lesch Klaus-Peter, Faraone Stephen V., et al. 2010 “Meta-Analysis of Genome-Wide Association Studies of Attention-Deficit/hyperactivity Disorder.” *Journal of the American Academy of Child and Adolescent Psychiatry* 49 (9): 884–97. [PubMed: 20732625]
- Nestadt Gerald, Grados Marco, and Samuels Jack F. 2010 “Genetics of Obsessive-Compulsive Disorder.” *The Psychiatric Clinics of North America* 33 (1): 141–58. [PubMed: 20159344]
- Nestadt G, Samuels J, Riddle M, Bienvenu OJ 3rd, Liang KY, LaBuda M, Walkup J, Grados M, and Hoehn-Saric R. 2000 “A Family Study of Obsessive-Compulsive Disorder.” *Archives of General Psychiatry* 57 (4): 358–63. [PubMed: 10768697]
- Okbay Aysu, Baselmans Bart M. L., Jan-Emmanuel De Neve Patrick Turley, Nivard Michel G., Fontana Mark Alan, Meddens S. Fleur W., et al. 2016 “Genetic Variants Associated with Subjective Well-Being, Depressive Symptoms, and Neuroticism Identified through Genome-Wide Analyses.” *Nature Genetics* 48 (6): 624–33. [PubMed: 27089181]
- Okbay Aysu, Beauchamp Jonathan P., Mark Alan Fontana James J. Lee, Pers Tune H., Rietveld Cornelius A., Turley Patrick, et al. 2016 “Genome-Wide Association Study Identifies 74 Loci Associated with Educational Attainment.” *Nature* 533 (7604): 539–42. [PubMed: 27225129]

- Orozco Gisela, Ioannidis John P. A., Morris Andrew, Zeggini Eleftheria, and DIAGRAM consortium. 2012 “Sex-Specific Differences in Effect Size Estimates at Established Complex Trait Loci.” *International Journal of Epidemiology* 41 (5): 1376–82. [PubMed: 22825589]
- Otowa T, Hek K, Lee M, Byrne EM, Mirza SS, Nivard MG, Bigdeli T, et al. 2016 “Meta-Analysis of Genome-Wide Association Studies of Anxiety Disorders.” *Molecular Psychiatry* 21 (10): 1485. [PubMed: 26857599]
- Pers Tune H., Timshel Pascal, and Hirschhorn Joel N.. 2015 “SNPsnap: A Web-Based Tool for Identification and Annotation of Matched SNPs.” *Bioinformatics* 31 (3): 418–20. [PubMed: 25316677]
- Pittenger Christopher, Bloch Michael H., and Williams Kyle. 2011 “Glutamate Abnormalities in Obsessive Compulsive Disorder: Neurobiology, Pathophysiology, and Treatment.” *Pharmacology & Therapeutics* 132 (3): 314–32. [PubMed: 21963369]
- Price Alkes L., Patterson Nick J., Plenge Robert M., Weinblatt Michael E., Shadick Nancy A., and Reich David. 2006 “Principal Components Analysis Corrects for Stratification in Genome-Wide Association Studies.” *Nature Genetics* 38 (8): 904–9. [PubMed: 16862161]
- Psychiatric GWAS Consortium Bipolar Disorder Working Group. 2011 “Large-Scale Genome-Wide Association Analysis of Bipolar Disorder Identifies a New Susceptibility Locus near ODZ4.” *Nature Genetics* 43 (10): 977–83. [PubMed: 21926972]
- Purcell Shaun, Neale Benjamin, Kathe Todd-Brown Lori Thomas, Ferreira Manuel A. R., Bender David, Maller Julian, et al. 2007 “PLINK: A Tool Set for Whole-Genome Association and Population-Based Linkage Analyses.” *American Journal of Human Genetics* 81 (3): 559–75. [PubMed: 17701901]
- Rahmioglu Nilufer, Macgregor Stuart, Drong Alexander W., Hedman Åsa K., Harris Holly R., Randall Joshua C., Prokopenko Inga, et al. 2015 “Genome-Wide Enrichment Analysis between Endometriosis and Obesity-Related Traits Reveals Novel Susceptibility Loci.” *Human Molecular Genetics* 24 (4): 1185–99. [PubMed: 25296917]
- Raj Towfique, Rothamel Katie, Mostafavi Sara, Ye Chun, Lee Mark N., Replogle Joseph M., Feng Ting, et al. 2014 “Polarization of the Effects of Autoimmune and Neurodegenerative Risk Alleles in Leukocytes.” *Science* 344 (6183): 519–23. [PubMed: 24786080]
- Randall Joshua C., Winkler Thomas W., Kutalik Zoltán, Berndt Sonja I., Jackson Anne U., Monda Keri L., Kilpeläinen Tuomas O., et al. 2013 “Sex-Stratified Genome-Wide Association Studies Including 270,000 Individuals Show Sexual Dimorphism in Genetic Loci for Anthropometric Traits.” *PLoS Genetics* 9 (6): e1003500. [PubMed: 23754948]
- Ruscio AM, Stein DJ, Chiu WT, and Kessler RC. 2010 “The Epidemiology of Obsessive-Compulsive Disorder in the National Comorbidity Survey Replication.” *Molecular Psychiatry* 15 (1): 53–63. [PubMed: 18725912]
- Scharf Jeremiah M., Yu Dongmei, Mathews Carol A., Neale Benjamin M., Stewart S. Evelyn, Fagerness Jesen A., Evans Patrick, et al. 2013 “Genome-Wide Association Study of Tourette’s Syndrome.” *Molecular Psychiatry* 18 (6): 721–28. [PubMed: 22889924]
- Schizophrenia Working Group of the Psychiatric Genomics Consortium. 2014 “Biological Insights from 108 Schizophrenia-Associated Genetic Loci.” *Nature* 511 (7510): 421–27. [PubMed: 25056061]
- Schumann Gunter, Liu Chunyu, Paul O’Reilly He Gao, Song Parkyong, Xu Bing, Ruggeri Barbara, et al. 2016 “KLB Is Associated with Alcohol Drinking, and Its Gene Product β -Klotho Is Necessary for FGF21 Regulation of Alcohol Preference.” *Proceedings of the National Academy of Sciences*, 11 10.1073/pnas.1611243113.
- Singh Sandeep K., Lupo Philip J., Scheurer Michael E., Saxena Anshul, Kennedy Amy E., Ibrahimou Boubakari, Barbieri Manuel Alejandro, et al. 2016 “A Childhood Acute Lymphoblastic Leukemia Genome-Wide Association Study Identifies Novel Sex-Specific Risk Variants.” *Medicine* 95 (46): e5300. [PubMed: 27861356]
- Slattery Marcia J., Dubbert Billinda K., Allen Albert J., Leonard Henrietta L., Swedo Susan E., and Gourley Mark F.. 2004 “Prevalence of Obsessive-Compulsive Disorder in Patients with Systemic Lupus Erythematosus.” *The Journal of Clinical Psychiatry* 65 (3): 301–6. [PubMed: 15096067]

- Snider LA, and Swedo SE. 2004 "PANDAS: Current Status and Directions for Research." *Molecular Psychiatry* 9 (10): 900–907. [PubMed: 15241433]
- Stewart SE, Yu D, Scharf JM, Neale BM, Fagerness JA, Mathews CA, Arnold PD, et al. 2013 "Genome-Wide Association Study of Obsessive-Compulsive Disorder." *Molecular Psychiatry* 18 (7): 788–98. [PubMed: 22889921]
- Swedo SE, Leckman JF, Rose NR - Pediatr Therapeut, and 2012. 2012 "From Research Subgroup to Clinical Syndrome: Modifying the PANDAS Criteria to Describe PANS (pediatric Acute-Onset Neuropsychiatric Syndrome)." *Kids.iocdf.org*. <https://kids.iocdf.org/wp-content/uploads/sites/6/2015/07/PANDAS-to-PANS-Final-form-for-Pediatrics-Therapeutics-2012.pdf>.
- Swedo SE, Leonard HL, Garvey M, Mittleman B, Allen AJ, Perlmutter S, Lougee L, Dow S, Zamkoff J, and Dubbert BK. 1998 "Pediatric Autoimmune Neuropsychiatric Disorders Associated with Streptococcal Infections: Clinical Description of the First 50 Cases." *The American Journal of Psychiatry* 155 (2): 264–71. [PubMed: 9464208]
- Swedo SE, Rapoport JL, Leonard H, Lenane M, and Cheslow D. 1989 "Obsessive-Compulsive Disorder in Children and Adolescents. Clinical Phenomenology of 70 Consecutive Cases." *Archives of General Psychiatry* 46 (4): 335–41. [PubMed: 2930330]
- Taylor Kira C., Carty Cara L., Dumitrescu Logan, Petra B žková Shelley A. Cole, Hindorff Lucia, Schumacher Fred R., et al. 2013 "Investigation of Gene-by-Sex Interactions for Lipid Traits in Diverse Populations from the Population Architecture Architecture Using Genomics and Epidemiology Study." *BMC Genetics* 14 (5): 33. [PubMed: 23634756]
- Tobacco and Genetics Consortium. 2010 "Genome-Wide Meta-Analyses Identify Multiple Loci Associated with Smoking Behavior." *Nature Genetics* 42 (5): 441–47. [PubMed: 20418890]
- Torres Albina Rodrigues, and Lima Maria Cristina Pereira. 2005 "[Epidemiology of obsessive-compulsive disorder: a review]." *Revista brasileira de psiquiatria* 27 (3): 237–42. [PubMed: 16224614]
- Watanabe Kyoko, Taskesen Erdogan, van Bochoven Arjen, and Posthuma Danielle 2017 "Functional Mapping and Annotation of Genetic Associations with FUMA." *Nature Communications* 8 (1): 1826.
- Weissman MM, Bland RC, Canino GJ, Greenwald S, Hwu HG, Lee CK, Newman SC, Oakley-Browne MA, Rubio-Stipec M, and Wickramaratne PJ. 1994 "The Cross National Epidemiology of Obsessive Compulsive Disorder. The Cross National Collaborative Group." *The Journal of Clinical Psychiatry* 55 Suppl (3): 5–10.
- Willer Cristen J., Li Yun, and Abecasis Gonçalo R.. 2010 "METAL: Fast and Efficient Meta-Analysis of Genomewide Association Scans." *Bioinformatics* 26 (17): 2190–91. [PubMed: 20616382]
- Winkler Thomas W., Justice Anne E., Graff Mariaelisa, Barata Llilda, Feitosa Mary F., Chu Su, Czajkowski Jacek, et al. 2015 "The Influence of Age and Sex on Genetic Associations with Adult Body Size and Shape: A Large-Scale Genome-Wide Interaction Study." *PLoS Genetics* 11 (10): e1005378. [PubMed: 26426971]
- Yang Jian, Lee S. Hong, Goddard Michael E., and Visscher Peter M.. 2011 "GCTA: A Tool for Genome-Wide Complex Trait Analysis." *American Journal of Human Genetics* 88 (1): 76–82. [PubMed: 21167468]
- Yu Dongmei, Mathews Carol A., Scharf Jeremiah M., Neale Benjamin M., Davis Lea K., Gamazon Eric R., Derks Eske M., et al. 2015 "Cross-Disorder Genome-Wide Analyses Suggest a Complex Genetic Relationship between Tourette's Syndrome and OCD." *The American Journal of Psychiatry* 172 (1): 82–93. [PubMed: 25158072]
- Zhuang Joanna J., and Morris Andrew P.. 2009 "Assessment of Sex-Specific Effects in a Genome-Wide Association Study of Rheumatoid Arthritis." *BMC Proceedings* 3 Suppl 7 (12): S90. [PubMed: 20018087]

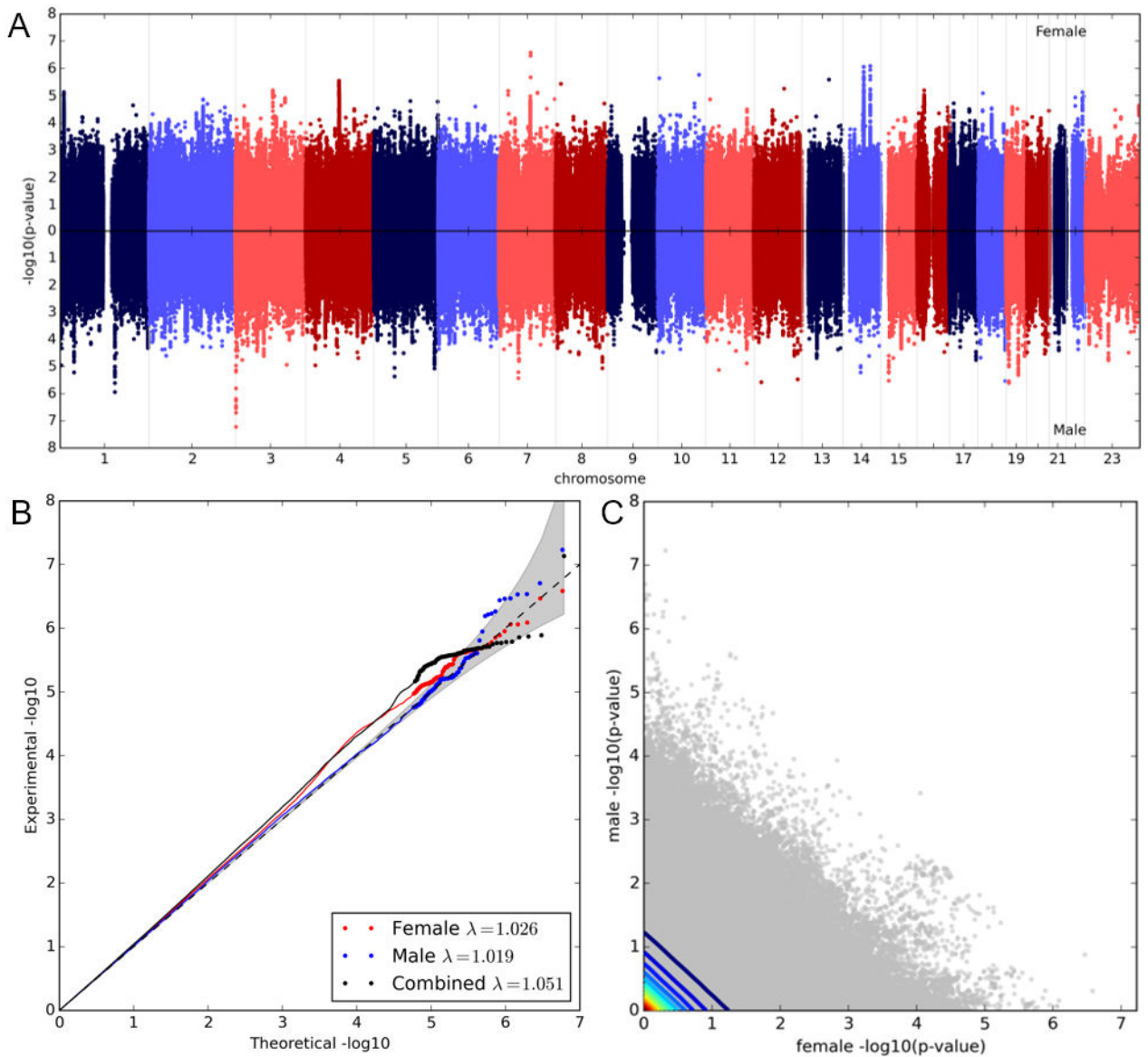


Figure 1. Manhattan and quantile-quantile plots for sex-stratified meta-GWAS. Meta-GWAS was run separately for females (1525 cases and 4307 controls) and males (1249 cases and 2789 controls) on ~5.5 million imputed SNPs (MAF>5%). (A) The peaks pointing up on the plot are the results for female analysis and the peaks pointing down are the results for male analysis. Although not genome-wide significant, several suggestive peaks can be observed in one sex and not observed in the other. (B) Quantile-quantile plot for sex-stratified and combined meta-GWAS. (C) Scatter plot of $-\log_{10}(\text{p-value})$ for female OCD associations (x-axis) versus male OCD associations (y-axis). Contour lines colored from red to blue indicate decreasing data density.

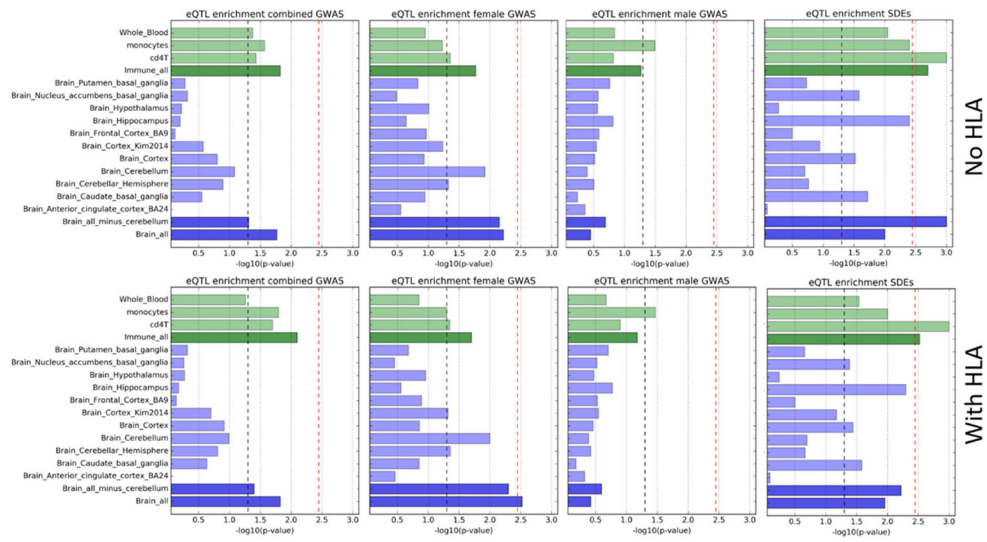


Figure 2. eQTL enrichment in the brain and immune tissues for combined, female-specific, male-specific top associations (10^{-3}) and SNPs with Sexually Differentiated Effect SNPs (SDEs), excluding and including SNPs in the HLA region. Only variants with more than 500 individuals in the GWAS are included here. Light green bars represent each immune tissue or cell type: whole blood, monocytes, and cd4+ T cells, while the dark green represents enrichment in a combination of the three immune tissues. Light blue bars represent each brain tissue, while the dark blue represents enrichment in a combination of ten brain tissues, or all ten brain tissues minus cerebellum. The black dashed line represents a p-value of 0.05. The red dashed line represents the significant p-value threshold (0.00357) after accounting for 14 eQTL datasets tested.

Table 1.

Top ten LD-independent ($r^2=0.2$) associations in male-specific and female-specific genome-wide association studies. For each variant, both female and male association betas and p-values are shown. All variants are annotated with genomic location. Each variant that is an eQTL is labeled with the target gene(s), with the source tissue listed in the table footnote (annotations derived from GTEx portal: <https://gtexportal.org>). Abbreviations: MAF, minor allele frequency; Chr, chromosome; SE, standard error; eGene, eQTL target gene.

MALE										
SNP	Chr	Male beta (SE)	Male p-value	Male MAF	Female beta (SE)	Female p-value	Female MAF	eGene	Genomic location *	
rs12635725	3	-0.291(0.054)	5.86E-08	0.45	-0.033(0.046)	4.82E-01	0.449	NA	Intergenic	
rs28696717	1	-0.436(0.090)	1.13E-06	0.082	-0.040(0.078)	6.11E-01	0.083	NA	Intergenic	
rs2927709	19	-0.262(0.056)	2.50E-06	0.328	-0.096(0.050)	5.37E-02	0.319	CD320	CD320	
rs11502414	12	-0.546(0.116)	2.63E-06	0.171	0.033(0.104)	7.53E-01	0.204	NA	Intergenic	
rs73001203	18	-0.403(0.086)	2.92E-06	0.313	-0.026(0.075)	7.28E-01	0.301	NA	Intergenic	
rs7183340	15	0.415(0.089)	2.98E-06	0.315	0.010(0.075)	8.89E-01	0.331	NA	TUBGCP5	
rs118110667	12	-0.540(0.116)	3.35E-06	0.115	-0.048(0.106)	6.48E-01	0.122	HCAR2	RP11-324E6.6	
rs11768490	7	-0.239(0.052)	3.68E-06	0.462	0.071(0.045)	1.15E-01	0.466	SEC61G	Intergenic	
rs6450514	5	-0.244(0.053)	4.33E-06	0.397	0.020(0.047)	6.78E-01	0.407	NA	PDE4D	
rs1260555	19	-0.245(0.054)	4.88E-06	0.383	0.095(0.046)	4.03E-02	0.366	NA	Intergenic	
FEMALE										
SNP	Chr	Male beta (SE)	Male p-value	Male MAF	Female beta (SE)	Female p-value	Female MAF	eGene	Genomic location *	
rs12536521	7	-0.092(0.135)	4.96E-01	0.058	1.378(0.268)	2.62E-07	0.052	NA	Intergenic	
rs2364841	14	0.030(0.077)	6.98E-01	0.129	0.322(0.065)	8.12E-07	0.126	NA	ADCK1	
rs1755715	14	-0.010(0.054)	8.53E-01	0.422	-0.235(0.048)	8.70E-07	0.417	JKAMP, DAAMI, L3HYPDH	GPR135	
rs12769537	10	-0.016(0.111)	8.85E-01	0.056	0.458(0.096)	1.67E-06	0.058	NA	Intergenic	
rs76983293	10	-0.021(0.139)	8.79E-01	0.054	0.549(0.116)	2.26E-06	0.056	NA	Intergenic	
rs75502311	13	-0.010(0.095)	9.16E-01	0.075	0.397(0.084)	2.54E-06	0.069	RP11-173B14.5	LMO7	
rs13110899	4	-0.061(0.054)	2.56E-01	0.313	-0.225(0.048)	2.80E-06	0.309	NA	GRID2	
rs352766	8	0.046(0.077)	5.51E-01	0.128	-0.296(0.064)	3.66E-06	0.131	NA	Intergenic	
rs1017722	12	-0.053(0.091)	5.64E-01	0.285	0.401(0.088)	5.46E-06	0.268	NA	Intergenic	
rs1840717	4	-0.105(0.052)	4.19E-02	0.459	-0.205(0.045)	5.80E-06	0.459	NA	GRID2	

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* None of the variants are exonic. For genes that are listed, the variants are intronic.

eQTLs: rs2927709;CD320:Transformed fibroblasts, Heart - Arterial Appendage; rs118110667;HCAR2: Esophagus-mucosa, Testis, Sun-exposed skin, Breast-mammary tissue, Not sun-exposed skin;
rs11768490;SEC61G:Thyroid; rs1755715:JKAMP: Transformed fibroblasts, Muscle-skeletal; DAAMI:Brain-cerebellum; L3HYPPDH: Adipose-Subcutaneous, Artery-Aorta, Artery-Tibial, Brain-Caudate,
Brain-Cerebellar Hemisphere, Brain-Cortex, Brain-Nucleus accumbens (basal ganglia); rs75502311;RP11-173B14.5:Muscle-Skeletal

Table 2.

Top ten LD-independent ($r^2=0.2$) SDEs. For each SDE, the female and male association betas and p-values, z-score and its p-value, and the genotype-sex interaction p-value are shown. All Variants are annotated as intergenic; however, none are exonic. Each variant that is an eQTL is labeled with the target gene(s), with the source tissue listed in the table footnote. Abbreviations: SDEs, SNPs with Sexually Dimorphic Effect; MAF, minor allele frequency; Chr, chromosome; SE, standard error; eQTL, expression quantitative trait locus; eGene, eQTL target gene.

SNP	Chr	Male beta (SE)	Male p-value	Male MAF	Female beta (SE)	Female p-value	Female MAF	eQTL eGene	SDE z-score	SDE p-value	GxS interaction p-value	Gene*
rs12536521	7	-0.09 (0.14)	4.96E-01	0.058	1.38 (0.27)	2.62E-07	0.052	NA	4.905	9.33E-07	1.60E-01	NA
rs47988525	18	0.28 (0.06)	2.13E-05	0.224	-0.14 (0.06)	1.27E-02	0.228	NA	-4.849	1.24E-06	2.06E-02	LAMAI
rs2077613	17	0.22 (0.05)	1.72E-05	0.425	-0.11 (0.05)	1.82E-02	0.427	NA	-4.795	1.63E-06	4.36E-06	NA
rs11064706	12	-0.21 (0.07)	4.44E-03	0.157	0.25 (0.06)	5.97E-05	0.153	NA	4.762	1.92E-06	1.94E-01	NA
rs79886445	6	-0.30 (0.10)	2.57E-03	0.084	0.30 (0.08)	1.88E-04	0.081	NA	4.694	2.68E-06	4.16E-06	NA
rs17815599	3	-0.27 (0.06)	2.45E-05	0.211	0.13 (0.06)	2.44E-02	0.209	NA	4.64	3.48E-06	3.40E-05	NA
rs11119584	1	0.18 (0.05)	8.54E-04	0.408	-0.15 (0.05)	1.46E-03	0.391	NA	-4.603	4.16E-06	3.35E-04	IL19
rs6034007	20	-0.13 (0.05)	1.08E-02	0.438	0.18 (0.05)	5.95E-05	0.435	NA	4.561	5.08E-06	1.19E-05	MACROD2
rs7334430	13	-0.29 (0.08)	5.47E-04	0.124	0.21 (0.07)	3.08E-03	0.122	NA	4.549	5.38E-06	1.41E-05	NA
rs11768490	7	-0.24 (0.05)	3.68E-06	0.462	0.07 (0.05)	1.15E-01	0.466	SEC61G	4.526	6.02E-06	3.78E-04	NA

* None of the variants are exonic. For genes that are listed, the variants are intronic.

eQTLs: rs11768490:SEC61G:Thyroid

Table 3.

Sex-stratified and combined heritability estimates for OCD from autosomes and the X chromosome. Abbreviations: OCD, obsessive-compulsive disorder; LDSC, linkage disequilibrium score regression; GCTA, genome-wide complex trait analysis; N, number of individuals in the analysis; h^2 , SNP-heritability; SE, standard error.

Condition	LDSC				GCTA						
	Autosomes		Autosomes		Autosomes		X Chromosome				
	N	h^2	SE	N	h^2	SE	N	h^2	SE	P-value	
Combined	9,870	0.225	0.045	7,051	0.238	0.033	8.62E-14	7,059	0.010	0.005	6.20E-03
Male	4,038	0.131	0.097	2,781	0.232	0.076	1.10E-03	2,778	0.028	0.013	9.80E-03
Female	5,832	0.296	0.079	4,274	0.240	0.057	1.07E-05	4,281	0.014	0.008	2.72E-02