ARTICLES

Genetic influences on schizophrenia and subcortical brain volumes: large-scale proof of concept

Schizophrenia is a devastating psychiatric illness with high heritability. Brain structure and function differ, on average, between people with schizophrenia and healthy individuals. As common genetic associations are emerging for both schizophrenia and brain imaging phenotypes, we can now use genome-wide data to investigate genetic overlap. Here we integrated results from common variant studies of schizophrenia (33,636 cases, 43,008 controls) and volumes of several (mainly subcortical) brain structures (11,840 subjects). We did not find evidence of genetic overlap between schizophrenia risk and subcortical volume measures either at the level of common variant genetic architecture or for single genetic markers. These results provide a proof of concept (albeit based on a limited set of structural brain measures) and define a roadmap for future studies investigating the genetic covariance between structural or functional brain phenotypes and risk for psychiatric disorders.

Schizophrenia is a devastating, highly heritable psychiatric disorder that affects approximately 1% of the population 1 . Despite marked recent successes in identifying genetic risk factors and pathways involved in schizophrenia $^{1-4}$, the neurobiology of schizophrenia remains poorly understood.

Many differences in brain function and structure have been reported in cases of schizophrenia as compared with controls, although there is considerable inter-individual heterogeneity. Of specific relevance to this study, recent meta-analyses found that people with schizophrenia have smaller hippocampus, amygdala, thalamus, nucleus accumbens and intracranial volumes, along with larger pallidum and lateral ventricle volumes^{5,6}. Hippocampal and lateral ventricle volumes are influenced by antipsychotic medication use⁵. In addition, mean hippocampal volume is smaller in high-risk individuals and in unaffected first-degree relatives of those with schizophrenia^{7,8}.

Structural brain measurements, such as those from magnetic resonance imaging (MRI), typically have high reproducibility and low measurement error and can be highly heritable ^{9,10}. Increasingly large studies of brain morphometry are being performed and are being used to evaluate the contributions of common and rare genetic variants to brain structure ^{9,11}.

With genome-wide association results available from large samples for schizophrenia and for MRI-based brain phenotypes, we can now use genomic approaches to evaluate the genetic link between disease risk and such brain measures. Findings of covariation would help us develop new hypotheses about the structures involved in the primary disease process of schizophrenia. In this proof-of-concept study, we created a roadmap for the analysis of genetic covariation using a battery of complementary methods. We evaluated the overlap of common genetic variation at the high level of genetic architecture as well as of individual genetic variants. We also evaluated common genetic variant effect sizes on neuroimaging phenotypes and schizophrenia. The data we analyzed are from large meta-analyses by the Psychiatric Genomics Consortium (PGC; http://pgc.unc.edu/) for schizophrenia³

and meta-analyses from the ENIGMA Consortium (Enhancing NeuroImaging Genetics through Meta-Analysis; http://enigma.ini.usc.edu/) for eight MRI volumetric measures (amygdala, caudate nucleus, hippocampus, nucleus accumbens, pallidum, putamen, thalamus, and intracranial volume (ICV))⁹. Our results suggest that common genetic variation predisposing to schizophrenia does not show evidence of overlap with common genetic variation influencing these eight brain structure volumes. Genetic effect sizes did not differ significantly for neuroimaging and schizophrenia phenotypes.

RESULTS

We analyzed genome-wide association data for schizophrenia (33,636 cases and 43,008 controls) and eight structural MRI brain measures (11,840 individuals). Sample characteristics are presented in **Supplementary Table 1**. These data were used for a comprehensive set of analyses of common variant genetic sharing between schizophrenia and brain volumetric measures.

Comparisons of common variant genetic architectures

Linkage disequilibrium score regression. We first used genomewide results to evaluate the high-level features of these traits and their genetic interrelations. Using genome-wide association (GWA) summary statistics, excluding the extended major histocompatibility complex region, we used linkage disequilibrium score regression (LDSR)¹² to estimate the heritability of schizophrenia due to common genetic variants, along with that of eight brain volumetric measures. The single nucleotide polymorphism (SNP)-based heritability of schizophrenia was 25.5% (s.e.m. = 1.1%) (**Table 1**). The SNPbased heritability estimates for the MRI measures ranged from 11% (nucleus accumbens) to 30% (putamen). The heritability for amygdala volume was nonsignificant in this sample. The genetic correlations of MRI volumetric measures with schizophrenia were all nonsignificant (Table 1). These negative findings stand in contrast to the relatively high common-variant correlations of schizophrenia with bipolar disorder and major depressive disorder^{13,14}.

A full list of authors and affiliations appears at the end of the paper.

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Table 1 SNP heritability analyses for MRI brain volume and genetic correlations with schizophrenia^a

Brain region ^a	Ν	Heritability	s.e.m.	Genetic correlation with SCZ	s.e.m.	Z	Р
Intracranial volume	9,826	0.157	0.050	-0.010	0.072	-0.137	0.891
Caudate nucleus	11,624	0.260	0.043	-0.095	0.057	-1.674	0.094
Hippocampus	11,621	0.135	0.041	-0.147	0.081	-1.826	0.068
Nucleus accumbens	11,603	0.105	0.045	-0.094	0.090	-1.051	0.293
Pallidum	11,595	0.137	0.047	-0.038	0.069	-0.546	0.585
Putamen	11,598	0.303	0.052	0.013	0.052	0.256	0.798
Thalamus	11,646	0.118	0.041	-0.113	0.087	-1.298	0.194

^aAmygdala heritability was too low to allow a valid analysis.

Genetic predisposition scores. In the genetic risk score approach 15 , we considered the ENIGMA GWA results as training sets in order to compute common variant genetic predisposition to (for instance) greater ICV for each schizophrenia case and control. We then compared the mean polygenic predisposition score in cases to that in controls. None of the correlations was significant after correction for eight comparisons (**Fig. 1** and **Table 2**). The strongest effect (for hippocampal volume) was almost entirely driven by one SNP (rs2268894) 9 , but only three SNPs met the *P*-value threshold of 1×10^{-6} for inclusion in this analysis. These null results are in contrast to the robust evidence for common variant genetic correlations between schizophrenia and other psychiatric disorders 16 .

Rank-rank hypergeometric overlap test¹⁷. We used this test to quantify overlap between pairs of GWA results ranked by their association statistics on the basis of 172,652 SNPs. The overlap of rank-ordered lists of genetic variants influencing any of the brain MRI volumes and those conferring risk for schizophrenia was not statistically significant (Fig. 2). The overlap between genetic contributions to putamen and caudate nucleus volumes was used as a positive control; the overlap between genetic contributions to hippocampal volume and the presumably unrelated trait of thumb fingerprint whorl structure¹⁸ was used as a negative control. The latter comparison showed similar overlap to that of brain structure and schizophrenia.

Sign tests. We compared the pattern of GWA results by checking whether the signs of the regression coefficients³ were consistently in the same direction between the top associations for schizophrenia

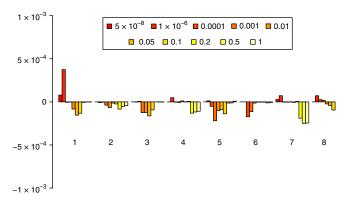


Figure 1 Genetic predisposition score analyses examining the predictive capacity of ENIGMA brain volumetric results on schizophrenia case-control status using different P-value thresholds. x axis: (1) hippocampus, (2) ICV, (3) nucleus accumbens, (4) amygdala, (5) caudate nucleus, (6) pallidum, (7) putamen, (8) thalamus. y axis shows Nagelkerke's R^2 . Positive values indicate SNP effects for increasing brain structure volume and increased risk for schizophrenia. Negative values indicate SNP effects for decreasing brain structure volume and increased risk for schizophrenia. Significance values are given in **Table 2**.

and those for the MRI volumetric measures. None of the sign tests showed consistent directions of effect (Table 3).

Analysis of single genetic variants

Genome-wide significant associations. We next searched for specific genetic regions associated with these traits. We evaluated the 128 genome-wide significant schizophrenia index SNPs³ for association with brain volumes⁹. One association survived correction for 876 comparisons: rs2909457*A (chr2:162,845,855, intergenic between SLC4A10 and DPP4) was associated with decreased hippocampal volume ($P=1.2\times10^{-6}$, effect size = -23 mm³ per allele) and decreased risk for schizophrenia (odds ratio = 0.94, $P=4.6\times10^{-8}$). However, this finding was in the opposite direction of expectations given previous observations of smaller hippocampal volumes in cases relative to controls⁶ (**Supplementary Table 2**). Starting with the eight SNPs previously found to be associated with the brain volumes⁹, no significant associations with schizophrenia were observed (**Supplementary Table 2**).

SNP meta-analyses. We also performed GWA meta-analyses of the schizophrenia and brain structure results. The Manhattan plots for these analyses are shown in **Supplementary Figures 1–8**. In **Supplementary Table 3**, the genome-wide significant findings are given. In most instances, the results were entirely driven by the association with schizophrenia.

Conjunction analysis. To identify individual SNPs that influence risk for both schizophrenia and brain structure, we implemented a conjunction test¹⁹. No SNP showed genome-wide significant association with both schizophrenia and brain structure, although several loci were detected at sub-threshold levels (**Supplementary Fig. 9**).

Comparison of genetic effect sizes for clinical and brain volume measures

Some investigators have suggested that common genetic variants underlying continuous brain imaging endophenotypes may have larger effect sizes than those for neuropsychiatric disorders (for example,

Table 2 Two outcome variables derived from genetic predisposition analysis

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Phenotype	Р	R^2	AUC	OR (95% CI)
Intracranial volume	0.247	-2.46×10^{-5}	0.512	0.944 (0.877,1.016)
Caudate nucleus	0.033	-8.35×10^{-5}	0.502	0.928 (0.864, 0.997)
Hippocampus	0.010	-1.23×10^{-4}	0.506	0.917 (0.853, 0.986)
Nucleus accumbens	0.002	-1.74×10^{-4}	0.500	0.928 (0.862, 0.9996)
Pallidum	0.985	6.21×10^{-9}	0.513	1.034 (0.963,1.111)
Putamen	0.607	-4.87×10^{-6}	0.515	0.971 (0.891,1.059)
Thalamus	0.221	-2.75×10^{-5}	0.510	0.959 (0.888,1.036)
Amygdala	0.806	1.11×10^{-6}	0.509	1.021 (0.951,1.096)

P is the significance, uncorrected for multiple testing. R^2 is Nagelkerke's correlation on the observed scale, corrected for principal components. AUC is area under the receiver operating characteristic curve; OR, odds ratio; CI, confidence interval.

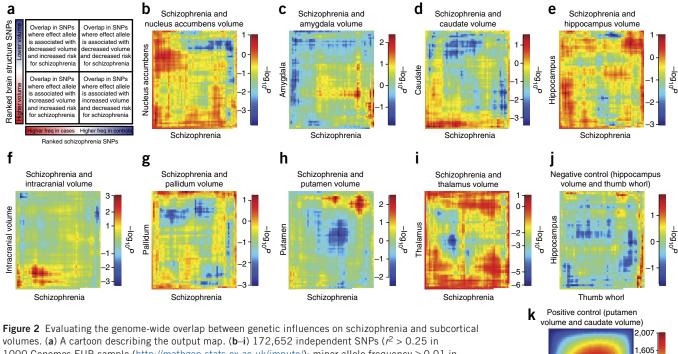


Figure 2 Evaluating the genome-wide overlap between genetic influences on schizophrenia and subcortical volumes. (a) A cartoon describing the output map. (b-i) 172,652 independent SNPs ($r^2 > 0.25$ in 1000 Genomes EUR sample (http://mathgen.stats.ox.ac.uk/impute/); minor allele frequency ≥ 0.01 in both ENIGMA2 and PGC2) present in both the PGC2 and ENIGMA2 studies were selected independent of association to any phenotype. Association results were then ordered on the basis of the significance of their association to the phenotype ($-\log_{10}P$ multiplied by the sign of the effect) and statistical significance was evaluated using the rank-rank hypergeometric overlap test (step size 3,000 SNPs). (j,k) The same test for overlap was conducted with a finger whorl phenotype (j), expected to have no overlap with brain structure genetics, and the overlap between caudate and putamen volume (k), expected to have very strong overlap. Overlap in the rank-ordered lists between genetic variants influencing any of the eight brain phenotypes and

those creating risk for schizophrenia was not statistically significant. In addition, the overlap between genetics of hippocampal volume and thumb whorl structure was used as a negative control and showed similar levels of overlap to brain structure and schizophrenia.

schizophrenia)^{20–22}. To test this hypothesis, we compared the maximum effect sizes from replicated genetic associations for each trait. For comparability across quantitative and binary traits, effect sizes were assessed as percentage of variance explained (for MRI volumes) or percentage of variance explained on the liability scale (for schizophrenia)²³. Individual common variants had only a small influence on either brain structure or schizophrenia (**Supplementary Fig. 10**).

Table 3 Sign tests of directional effects among 94 genome-wide significant associations with schizophrenia ($P < 5 \times 10^{-8}$) and the top 231 associations ($P < 1 \times 10^{-6}$)

P threshold	N same direction	Proportion	P
<5 × 10 ⁻⁸	49	0.52	0.379
$< 5 \times 10^{-8}$	47	0.50	0.541
$< 5 \times 10^{-8}$	46	0.49	0.621
$< 5 \times 10^{-8}$	48	0.51	0.459
$< 5 \times 10^{-8}$	51	0.54	0.235
$< 5 \times 10^{-8}$	52	0.55	0.177
$< 5 \times 10^{-8}$	49	0.52	0.379
$< 5 \times 10^{-8}$	49	0.52	0.379
$< 1 \times 10^{-6}$	121	0.52	0.255
$< 1 \times 10^{-6}$	113	0.49	0.653
$< 1 \times 10^{-6}$	105	0.45	0.926
$< 1 \times 10^{-6}$	109	0.47	0.821
$< 1 \times 10^{-6}$	117	0.51	0.448
$< 1 \times 10^{-6}$	115	0.50	0.552
$< 1 \times 10^{-6}$	115	0.50	0.552
$< 1 \times 10^{-6}$	109	0.47	0.821
	<5 × 10 ⁻⁸ <5 × 10 ⁻⁶ <1 × 10 ⁻⁶	$ \begin{array}{c ccccc} P \text{threshold} & \text{direction} \\ \hline <5 \times 10^{-8} & 49 \\ <5 \times 10^{-8} & 47 \\ <5 \times 10^{-8} & 46 \\ <5 \times 10^{-8} & 48 \\ <5 \times 10^{-8} & 51 \\ <5 \times 10^{-8} & 52 \\ <5 \times 10^{-8} & 49 \\ <1 \times 10^{-6} & 121 \\ <1 \times 10^{-6} & 113 \\ <1 \times 10^{-6} & 105 \\ <1 \times 10^{-6} & 109 \\ <1 \times 10^{-6} & 117 \\ <1 \times 10^{-6} & 115 \\ <1 \times 10^{-6} & 115 \\ <1 \times 10^{-6} & 115 \\ \end{array} $	$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$

The expected proportion under the null hypothesis is 0.5.

Effect sizes for individual SNPs were similar for both brain structure and schizophrenia and were of the same order as those observed for anthropometric traits such as height 24 .

Putamen

.203

801

400

Caudate

DISCUSSION

In this proof-of-concept study, we evaluated the relationship between common genetic variants implicated in schizophrenia and those associated with subcortical brain volumes and ICV. The sample sizes were the largest yet applied to these questions. With a comprehensive set of analyses, we did not find evidence for notable genetic correlations, either at a high level (that is, common variant genetic architecture) or for single genetic markers. Our findings do not support the hypothesis that these subcortical brain volume measures and ICV are causally associated with schizophrenia risk. Similarly, we did not find evidence that common SNPs have pleiotropic effects on these MRI volumes and schizophrenia. Our results suggest alternative hypotheses that require consideration and refutation: that the volumetric differences observed in schizophrenia may be epiphenomena unrelated to its primary genetic causes, may be a result of prenatal environment or may result from reverse causation²⁵. Finally, the effect sizes of SNPs implicated in schizophrenia and those associated with brain volumes were broadly similar.

We studied a limited set of brain MRI measures. Our study should be considered a proof-of-concept for evaluating genetic covariation rather than decisively addressing the full range of hypotheses pertaining to the genetic overlap of brain imaging measures with neuropsychiatric disease risk. We provide a rigorous roadmap for more definitive and larger future studies. Full elucidation of the brain correlates of schizophrenia will require a fuller set of structural and functional imaging measures (perhaps at the voxel level) along with evaluation of common and rare genetic variation.

The null findings of this study should be interpreted in light of several qualifiers. First, several brain regions that are not expected a priori to overlap with schizophrenia were included for completeness (for example, caudate and putamen volumes are uncorrelated with schizophrenia^{5,6}, and amygdala volume did not have SNP heritability different from zero in our study). Second, other neuroimaging phenotypes could be more informative for schizophrenia (for example, cortical thickness, ventricular volume, diffusion tensor imaging or functional activity)^{26,27}. Indeed, genetic variants associated with disease may influence distinct cell types within circumscribed neural circuits that may not be captured by MRI. Third, the ENIGMA MRI protocol served to harmonize images obtained from different scanners and protocols. While we have shown that this performs well, any genetic signal might have been lessened. Fourth, in this study of adults, we may not have observed the brain regions at the most appropriate time for identifying genetic overlap with schizophrenia, given that the volumes of most subcortical brain structures plateau in late adolescence to early adulthood. While schizophrenia is widely believed to be a neurodevelopmental disorder²⁸, its onset generally follows the period of greatest growth for these structures. Fifth, relatively small genetic correlations between schizophrenia and these brain volumes may have been masked by combining data sets in a meta-analytic framework; for example, heterogeneous sample characteristics such as age, sex and technical noise resulting from different MRI scanners or acquisition sequences may remain. It is conceivable that this resulted in the lower than expected SNP heritability for some of these measures. Mega-analysis could be an important way to improve control for heterogeneity. Sixth, we evaluated only common genetic variation. Although common genetic variation explains far more of the risk for schizophrenia than rare copy number variation or rare deleterious exonic variation², rare genetic effects on brain structure could be salient for some cases of schizophrenia. Finally, the sample sizes and statistical power of the schizophrenia and neuroimaging data sets differed. The PGC has attained a sample size sufficient to detect many common loci of small effect, whereas ENIGMA is earlier in the discovery arc²⁹.

Heritability estimates from genome-wide data obtained using LDSR¹⁴ were lower than observed in previous studies³⁰. This was expected for the subcortical regions, as those were corrected for ICV. For schizophrenia, a likely source of difference with previous studies is the removal of the extended MHC region from our analysis.

Although we found no evidence for genetic correlation between subcortical volumes and schizophrenia, we also investigated whether effect sizes of genetic variants are larger for brain measures than for schizophrenia. This point has been debated with respect to endophenotype studies, which attempt to identify quantifiable brain measures or other biomarkers thought to be intermediate between genotype and the liability to a disorder ^{31–33}. An endophenotype that lies on a causal pathway to a clinical disorder could increase power for genetic studies. Previous studies addressed this hypothesis in far smaller samples. We compared SNP effect sizes for the top findings for schizophrenia with those for subcortical volumes (hippocampus, putamen, caudate) and ICV. The results of this analysis showed similar effect sizes. The endophenotype concept is unlikely to be sufficiently addressed in these analyses given the reasons noted above.

In conclusion, this study presents a roadmap for comprehensive evaluation of genetic covariation between neuropsychiatric disease

liability and brain imaging measures. The present analysis was limited to a small number of brain volume phenotypes, and no evidence of genetic overlap was identified. More extensive brain-wide and genome-wide analyses may help in the mechanistic dissection of genetic risk for disease.

METHODS

Methods and any associated references are available in the online version of the paper.

Note: Any Supplementary Information and Source Data files are available in the online version of the paper.

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AUTHOR CONTRIBUTIONS

Study conception and supervision: B. Franke, B.M.N., J.L.S., M.C.O'D., P.F.S., P.M.T., S.E.M. Design of ENIGMA or PGC: A.A.-V., A.M.M., B. Franke, B.M.N., D.P.H., J.A.T., J.L.S., J.W.S., K.J.E.v.H., M.C.N., M.C.O'D., O.A.A., P.F.S., P.L., P.M.T., S.E.M., S. Ripke, T.E.N., V.A., Y.Y., Y.Y.W.H. Obtained funding: B. Franke, M.C.O'D., M.J.W., N.G.M., P.F.S., P.M.T. Provided samples: PGC2 Schizophrenia Working Group and ENIGMA2 Consortium. Conducted analyses: A.A.-V., B.M.N., D.P.H., J.L.S., K.J.E.v.H., M.C.N., P.L., S.E.M., S. Ripke, T.E.N., V.A., Y.Y.W.H. Writing group: A.A.-V., B. Franke, B.M.N., D.P.H., J.L.S., K.J.E.v.H., M.C.O'D., P.F.S., P.M.T., S.E.M., S. Ripke, V.A. All authors reviewed and approved the final version of this manuscript.

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The authors declare competing financial interests: details are available in the online version of the paper.

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- Sullivan, P.F., Daly, M.J. & O'Donovan, M. Genetic architectures of psychiatric disorders: the emerging picture and its implications. *Nat. Rev. Genet.* 13, 537–551 (2012).
- Purcell, S.M. et al. A polygenic burden of rare disruptive mutations in schizophrenia. Nature 506, 185–190 (2014).
- Schizophrenia Working Group of the Psychiatric Genomics Consortium. Biological insights from 108 schizophrenia-associated genetic loci. *Nature* 511, 421–427 (2014).

- Network and Pathway Analysis Subgroup of Psychiatric Genomics Consortium. Psychiatric genome-wide association study analyses implicate neuronal, immune and histone pathways. Nat. Neurosci. 18, 199–209 (2015).
- van Erp, T.G. et al. Subcortical brain volume abnormalities in 2028 individuals with schizophrenia and 2540 healthy controls via the ENIGMA consortium. Mol. Psychiatry doi:10.1038/mp.2015.63 (2 June 2015).
- Haijma, S.V. et al. Brain volumes in schizophrenia: a meta-analysis in over 18 000 subjects. Schizophr. Bull. 39, 1129–1138 (2013).
- Boos, H.B., Aleman, A., Cahn, W., Hulshoff Pol, H. & Kahn, R.S. Brain volumes in relatives of patients with schizophrenia: a meta-analysis. *Arch. Gen. Psychiatry* 64, 297–304 (2007).
- Thermenos, H.W. et al. A review of neuroimaging studies of young relatives of individuals with schizophrenia: a developmental perspective from schizotaxia to schizophrenia. Am. J. Med. Genet. B. Neuropsychiatr. Genet. 162B, 604–635 (2013).
- Hibar, D.P. et al. & Alzheimer's Disease Neuroimaging Initiative; CHARGE Consortium; EPIGEN; IMAGEN; SYS. Common genetic variants influence human subcortical brain structures. Nature 520, 224–229 (2015).
- Blokland, G.A., de Zubicaray, G.I., McMahon, K.L. & Wright, M.J. Genetic and environmental influences on neuroimaging phenotypes: a meta-analytical perspective on twin imaging studies. *Twin Res. Hum. Genet.* 15, 351–371 (2012).
- Stefansson, H. et al. CNVs conferring risk of autism or schizophrenia affect cognition in controls. Nature 505, 361–366 (2014).
- Bulik-Sullivan, B.K. et al. & Schizophrenia Working Group of the Psychiatric Genomics Consortium. LD Score regression distinguishes confounding from polygenicity in genome-wide association studies. Nat. Genet. 47, 291–295 (2015).
- Lee, S.H. et al. Cross-Disorder Group of the Psychiatric Genomics Consortium; International Inflammatory Bowel Disease Genetics Consortium (IIBDGC). Genetic relationship between five psychiatric disorders estimated from genome-wide SNPs. Nat. Genet. 45, 984–994 (2013).
- 14. Bulik-Sullivan, B. *et al.* & ReproGen Consortium; Psychiatric Genomics Consortium; Genetic Consortium for Anorexia Nervosa of the Wellcome Trust Case Control Consortium 3. An atlas of genetic correlations across human diseases and traits. *Nat. Genet.* 47, 1236–1241 (2015).
- Purcell, S.M. et al. & International Schizophrenia Consortium. Common polygenic variation contributes to risk of schizophrenia and bipolar disorder. Nature 460, 748–752 (2009).
- Cross-Disorder Group of the Psychiatric Genomics Consortium. Identification of risk loci with shared effects on five major psychiatric disorders: a genome-wide analysis. *Lancet* 381, 1371–1379 (2013).

- Plaisier, S.B., Taschereau, R., Wong, J.A. & Graeber, T.G. Rank-rank hypergeometric overlap: identification of statistically significant overlap between gene-expression signatures. *Nucleic Acids Res.* 38, e169 (2010).
- Ho, Y.Y.W. et al. Common genetic variants influence whorls in fingerprint patterns. J. Invest. Dermatol. (in the press).
- Nichols, T., Brett, M., Andersson, J., Wager, T. & Poline, J.B. Valid conjunction inference with the minimum statistic. *Neuroimage* 25, 653–660 (2005).
- Rose, E.J. & Donohoe, G. Brain vs behavior: an effect size comparison of neuroimaging and cognitive studies of genetic risk for schizophrenia. Schizophr. Bull. 39, 518–526 (2013).
- Mier, D., Kirsch, P. & Meyer-Lindenberg, A. Neural substrates of pleiotropic action of genetic variation in COMT: a meta-analysis. *Mol. Psychiatry* 15, 918–927 (2010)
- Hariri, A.R. & Weinberger, D.R. Imaging genomics. Br. Med. Bull. 65, 259–270 (2003).
- Witte, J.S., Visscher, P.M. & Wray, N.R. The contribution of genetic variants to disease depends on the ruler. Nat. Rev. Genet. 15, 765–776 (2014).
- 24. Wood, A.R. et al. & Electronic Medical Records and Genomics (eMEMERGEGE) Consortium; MIGen Consortium; PAGEGE Consortium; LifeLines Cohort Study. Defining the role of common variation in the genomic and biological architecture of adult human height. Nat. Genet. 46, 1173–1186 (2014).
- Toulopoulou, T. et al. Reciprocal causation models of cognitive vs volumetric cerebral intermediate phenotypes for schizophrenia in a pan-European twin cohort. Mol. Psychiatry 20, 1386–1396 (2015).
- Minzenberg, M.J., Laird, A.R., Thelen, S., Carter, C.S. & Glahn, D.C. Meta-analysis of 41 functional neuroimaging studies of executive function in schizophrenia. *Arch. Gen. Psychiatry* 66, 811–822 (2009).
- Narr, K.L. et al. Mapping cortical thickness and gray matter concentration in first episode schizophrenia. Cereb. Cortex 15, 708–719 (2005).
- Weinberger, D.R. On the plausibility of "the neurodevelopmental hypothesis" of schizophrenia. Neuropsychopharmacology 14 (suppl. 3), 1S–11S (1996).
- Visscher, P.M., Brown, M.A., McCarthy, M.I. & Yang, J. Five years of GWAS discovery. Am. J. Hum. Genet. 90, 7–24 (2012).
- Ge, T. et al. Massively expedited genome-wide heritability analysis (MEGHA). Proc. Natl. Acad. Sci. USA 112, 2479–2484 (2015).
- 31. Gottesman, I.I. & Gould, T.D. The endophenotype concept in psychiatry: etymology and strategic intentions. *Am. J. Psychiatry* **160**, 636–645 (2003).
- Kendler, K.S. & Neale, M.C. Endophenotype: a conceptual analysis. *Mol. Psychiatry* 15, 789–797 (2010).
- Cannon, T.D. & Keller, M.C. Endophenotypes in the genetic analyses of mental disorders. *Annu. Rev. Clin. Psychol.* 2, 267–290 (2006).

Barbara Franke^{1-3,43}, Jason L Stein^{4,5,43}, Stephan Ripke^{6-8,43}, Verneri Anttila^{6,7}, Derrek P Hibar⁴, Kimm J E van Hulzen^{1,3}, Alejandro Arias-Vasquez^{1-3,9}, Jordan W Smoller^{7,10,11}, Thomas E Nichols^{12,13}, Michael C Neale¹⁴, Andrew M McIntosh¹⁵, Phil Lee^{7,10,11}, Francis J McMahon¹⁶, Andreas Meyer-Lindenberg¹⁷, Manuel Mattheisen¹⁸⁻²⁰, Ole A Andreassen^{21,22}, Oliver Gruber²³, Perminder S Sachdev^{24,25}, Roberto Roiz-Santiañez^{26,27}, Andrew J Saykin²⁸⁻³⁰, Stefan Ehrlich³¹, Karen A Mather²⁴, Jessica A Turner^{32,33}, Emanuel Schwarz¹⁷, Anbupalam Thalamuthu²⁴, Yin Yao¹⁶, Yvonne Y W Ho³⁴, Nicholas G Martin³⁴, Margaret J Wright^{34,35}, Schizophrenia Working Group of the Psychiatric Genomics Consortium³⁶, ENIGMA Consortium³⁶, Michael C O'Donovan^{37,38,44}, Paul M Thompson^{4,44}, Benjamin M Neale^{6,7,10,39,44}, Sarah E Medland^{34,44} & Patrick F Sullivan^{40-42,44}

Other contributing authors are as follows:

PGC schizophrenia working group collaborators:

Stephan Ripke^{6-8,43}, Benjamin M Neale^{6,7,10,39,44}, Aiden Corvin⁴⁵, James T R Walters³⁷, Kai-How Farh⁶, Peter A Holmans^{37,38}, Phil Lee^{7,10,11}, Brendan Bulik-Sullivan^{6,7}, David A Collier^{46,47}, Hailiang Huang^{6,39}, Tune H Pers³⁹, Ingrid Agartz⁴⁸⁻⁵⁰, Esben Agerbo¹⁹, Margot Albus⁵¹, Madeline Alexander⁵², Farooq Amin^{53,54}, Silviu A Bacanu⁵⁵, Martin Begemann⁵⁶, Richard A Belliveau Jr⁷, Judit Bene^{57,58}, Sarah E Bergen^{7,40}, Elizabeth Bevilacqua⁷, Tim B Bigdeli⁵⁵, Donald W Black⁵⁹, Richard Bruggeman⁶⁰, Nancy G Buccola⁶¹, Randy L Buckner⁶²⁻⁶⁴, William F Byerley⁶⁵, Wiepke Cahn⁶⁶, Guiqing Cai^{67,68}, Murray J Cairns⁶⁹⁻⁷¹, Dominique Campion⁷², Rita M Cantor⁷³, Vaughan J Carr^{69,74}, Noa Carrera³⁷, Stanley V Catts^{69,75}, Kimberley D Chambert⁷, Raymond C K Chan⁷⁶, Eric Y H Chen^{77,78}, Ronald Y L Chen⁷⁸, Wei Cheng⁷⁹, Eric F C Cheung⁸⁰, Siow Ann Chong⁸¹, C Robert Cloninger⁸², David Cohen⁸³, Nadine Cohen⁸⁴, Paul Cormican⁴⁵, Nick Craddock^{37,38}, Benedicto Crespo-Facorro^{85,86}, James J Crowley⁴¹, David Curtis^{87,88}, Michael Davidson⁸⁹, Kenneth L Davis⁶⁷, Franziska Degenhardt^{90,91}, Jurgen Del Favero⁹², Lynn E DeLisi¹¹, Ditte Demontis¹⁹,





Dimitris Dikeos⁹³, Timothy Dinan⁹⁴, Srdjan Djurovic^{48,95}, Gary Donohoe^{45,96}, Elodie Drapeau⁶⁷, Jubao Duan^{97,98}, Frank Dudbridge⁹⁹, Peter Eichhammer¹⁰⁰, Johan Eriksson^{101–103}, Valentina Escott-Price³⁷, Laurent Essioux¹⁰⁴, Ayman H Fanous^{105–108}, Martilias S Farrell⁴¹, Josef Frank¹⁰⁹, Lude Franke¹¹⁰, Robert Freedman¹¹¹, Nelson B Freimer¹¹², Joseph I Friedman⁶⁷, Menachem Fromer^{6,7,10}, Giulio Genovese⁷, Lyudmila Georgieva³⁷, Elliot S Gershon¹¹³, Ina Giegling^{114,115}, Paola Giusti-Rodríguez⁴¹, Stephanie Godard¹¹⁶, Jacqueline I Goldstein^{6,39}, Srihari Gopal¹¹⁷, Jacob Gratten¹¹⁸, Lieuwe de Haan¹¹⁹, Christian Hammer⁵⁶, Marian L Hamshere³⁷, Mark Hansen¹²⁰, Thomas Hansen¹⁹, Vahram Haroutunian^{67,121,122}, Annette M Hartmann¹¹⁴, Frans A Henskens^{69,123,124}, Stefan L Herms^{90,91,125}, Joel N Hirschhorn³⁹, Per Hoffmann^{90,91,125}, Andrea Hofman^{90,91}, Mads V Hollegaard¹²⁶, David M Hougaard¹²⁶, Masashi Ikeda¹²⁷, Inge Joa¹²⁸, Antonio Julià¹²⁹, Anna K Kähler⁴⁰, René S Kahn⁶⁶, Luba Kalaydjieva^{130,131}, Sena Karachanak-Yankova¹³², Juha Karjalainen¹¹⁰, David Kavanagh³⁷, Matthew C Keller¹³³, Brian J Kelly⁷⁰, James L Kennedy^{134–136}, Andrey Khrunin¹³⁷, Yunjung Kim⁴¹, Janis Klovins¹³⁸, James A Knowles¹³⁹, Bettina Konte¹¹⁴, Vaidutis Kucinskas¹⁴⁰, Zita Ausrele Kucinskiene¹⁴⁰, Hana Kuzelova-Ptackova¹⁴¹, Claudine Laurent^{52,142}, S Hong Lee¹¹⁸, Jimmy Lee Chee Keong^{81,143}, Sophie E Legge³⁷, Bernard Lerer¹⁴⁴, Miaoxin Li^{77,78,145}, Tao Li¹⁴⁶, Kung-Yee Liang¹⁴⁷, Jeffrey Lieberman¹⁴⁸, Svetlana Limborska¹³⁷, Jouko Lönnqvist¹⁴⁹, Carmel M Loughland^{69,70}, Jan Lubinski¹⁵⁰, Milan Macek Jr¹⁵¹, Patrik K E Magnusson⁴⁰, Brion S Maher¹⁵², Wolfgang Maier¹⁵³, Jacques Mallet¹⁵⁴, Sara Marsal¹²⁹, Manuel Mattheisen^{18–20}, Morten Mattingsdal^{48,155}, Robert W McCarley¹¹, Colm McDonald¹⁵⁶, Andrew M McIntosh¹⁵, Sandra Meier¹⁵⁷, Carin J Meijer¹¹⁹, Bela Melegh^{57,58}, Ingrid Melle²², Raquelle I Mesholam-Gately¹¹, Andres Metspalu¹⁵⁸, Patricia T Michie^{69,159}, Lili Milani¹⁵⁸, Vihra Milanova¹⁶⁰, Younes Mokrab¹⁶¹, Derek W Morris^{45,96}, Ole Mors¹⁹, Bertram Müller-Myhsok^{162–164}, Kieran C Murphy¹⁶⁵, Robin M Murray¹⁶⁶, Inez Myin-Germeys¹⁶⁷, Mari Nelis¹⁵⁸, Igor Nenadic¹⁶⁸, Deborah A Nertney¹⁶⁹, Gerald Nestadt¹⁷⁰, Kristin K Nicodemus¹⁷¹, Liene Nikitina-Zake¹³⁸, Laura Nisenbaum¹⁷², Annelie Nordin¹⁷³, Eadbhard O'Callaghan¹⁷⁴, Colm O'Dushlaine⁷, F Anthony O'Neill¹⁷⁵, Sang-Yun Oh¹⁷⁶, Ann Olincy¹¹¹, Line Olsen¹⁹, Jim Van Os^{167,177}, Christos Pantelis^{69,178}, George N Papadimitriou⁹³, Sergi Papiol⁵⁶, Elena Parkhomenko⁶⁷, Michele T Pato¹³⁹, Tiina Paunio^{179,180}, Psychosis Endophenotypes International Consortium¹⁸¹, Diana O Perkins⁴², Olli Pietiläinen^{179,182}, Jonathan Pimm⁸⁸, Andrew J Pocklington³⁷, John Powell¹⁶⁶, Alkes Price³⁹, Ann E Pulver¹⁷⁰, Shaun M Purcell¹⁸³, Digby Quested¹⁸⁴, Henrik B Rasmussen¹⁹, Abraham Reichenberg⁶⁷, Mark A Reimers⁵⁵, Alexander L Richards^{37,38}, Joshua L Roffman^{63,64}, Panos Roussos^{183,185}, Douglas M Ruderfer³⁷, Veikko Salomaa¹⁰², Alan R Sanders^{97,186}, Ulrich Schall^{69,70}, Christian R Schubert¹⁸⁷, Thomas G Schulze^{109,188}, Sibylle G Schwab¹⁸⁹, Edward M Scolnick⁷, Rodney J Scott^{69,71,190}, Larry J Seidman¹¹, Jianxin Shi¹⁹¹, Jeremy M Silverman^{67,192}, Kang Sim⁸¹, Petr Slominsky¹³⁷, Jordan W Smoller^{7,10,11}, Hon-Cheong So⁷⁸, Erik Söderman⁵⁰, Chris C A Spencer¹⁹³, Eli A Stahl³⁹, Elisabeth Stogmann¹⁹⁴, Richard E Straub¹⁹⁵, Eric Strengman^{66,196}, Jana Strohmaier¹⁵⁷, T Scott Stroup¹⁴⁸, Mythily Subramaniam⁸¹, Jaana Suvisaari¹⁴⁹, Dragan M Svrakic⁸², Jin P Szatkiewicz⁴¹, Srinivas Thirumalai¹⁹⁷, Draga Toncheva¹⁹⁸, Paul A Tooney^{69,71,199}, Juha Veijola^{200,201}, John Waddington²⁰², Dermot Walsh²⁰³, Dai Wang¹¹⁷, Qiang Wang²⁰⁴, Bradley T Webb⁵⁵, Mark Weiser⁸⁹, Dieter B Wildenauer²⁰⁵, Nigel M Williams³⁷, Stephanie Williams⁴¹, Stephanie H Witt¹⁰⁹, Aaron R Wolen⁵⁵, Emily H M Wong⁷⁸, Brandon K Wormley⁵⁵, Jing Qin Wu^{69,71}, Hualin Simon Xi²⁰⁶, Clement C Zai^{134,135}, Xuebin Zheng²⁰⁷, Fritz Zimprich¹⁹⁴, Naomi R Wray¹¹⁸, Peter M Visscher¹¹⁸, Wellcome Trust Case Control Consortium 2²⁰⁸, Rolf Adolfsson¹⁷³, Ole A Andreassen^{21,22}, Douglas H R Blackwood²⁰⁹, Anders D Børglum¹⁹, Elvira Bramon²¹⁰, Joseph D Buxbaum^{67,68,122,211}, Sven Cichon^{90,91,125,212}, Ariel Darvasi²¹³, Enrico Domenici²¹⁴, Hannelore Ehrenreich⁵⁶, Tõnu Esko³⁹, Pablo V Gejman^{97,186}, Michael Gill⁴⁵, Hugh Gurling⁸⁸, Christina M Hultman⁴⁰, Nakao Iwata¹²⁷, Assen V Jablensky^{69,215–217}, Erik G Jönsson^{48,50}, Kenneth S Kendler⁵⁵, George Kirov³⁷, Jo Knight^{134–136}, Todd Lencz^{218–220}, Douglas F Levinson⁵², Qingqin S Li¹¹⁷, Jianjun Liu^{207,221}, Anil K Malhotra^{218–220}, Steven A McCarroll⁷, Andrew McQuillin⁸⁸, Jennifer L Moran⁷, Preben B Mortensen¹⁹, Bryan J Mowry^{169,222}, Markus M Nöthen^{90,91}, Roel A Ophoff^{66,73,112}, Michael J Owen^{37,38}, Aarno Palotie^{7,10}, Carlos N Pato¹³⁹, Tracey L Petryshen^{7,11}, Danielle Posthuma^{223–225}, Marcella Rietschel¹⁰⁹, Brien P Riley⁵⁵, Dan Rujescu^{114,115}, Pak C Sham^{77,78,145}, Pamela Sklar^{122,183,185}, David St Clair²²⁶, Daniel R Weinberger^{195,227}, Jens R Wendland¹⁸⁷, Thomas Werge¹⁹, Mark J Daly^{6,7,39}, Patrick F Sullivan^{40-42,44} & Michael C O'Donovan^{37,38,44}

ENIGMA2 Consortium collaborators:

Derrek P Hibar 4,43 , Jason L Stein 4,5,43 , Miguel E Renteria 34,43 , Alejandro Arias-Vasquez $^{1-3,9,43}$, Sylvane Desrivières 43,228 , Neda Jahanshad 229 , Roberto Toro 230 , Katharina Wittfeld 231,232 , Lucija Abramovic 233 , Micael Andersson 234 ,

Benjamin S Aribisala^{235–237}, Nicola J Armstrong²⁴, Manon Bernard²³⁸, Marc M Bohlken²³³, Marco P Boks²³³, Janita Bralten^{1,3,9}, Andrew A Brown²¹, M Mallar Chakravarty^{239,240}, Qiang Chen¹⁹⁵, Christopher R K Ching²²⁹, Gabriel Cuellar-Partida³⁴, Anouk den Braber²⁴¹, Sudheer Giddaluru^{242,243}, Aaron L Goldman¹⁹⁵, Oliver Grimm¹⁷, Tulio Guadalupe^{244,245}, Johanna Hass³¹, Girma Woldehawariat²⁴⁶, Avram J Holmes⁶³, Martine Hoogman^{1,3}, Deborah Janowitz²³², Tianye Jia²²⁸, Sungeun Kim^{28,29}, Marieke Klein^{1,3}, Bernd Kraemer²³, Phil Lee^{7,10,11}, Loes M Olde Loohuis²⁴⁷, Michelle Luciano²⁴⁸, Christine Macare²²⁸, Karen A Mather²⁴, Manuel Mattheisen^{18–20}, Yuri Milaneschi²⁴⁹, Kwangsik Nho^{28,29}, Martina Papmeyer¹⁵, Adaikalavan Ramasamy^{250,251}, Shannon L Risacher^{28,29}, Roberto Roiz-Santiañez^{26,27}, Emma J Rose⁴⁵, Alireza Salami²³⁴, Philipp G Sämann²⁵², Lianne Schmaal²⁴⁹, Andrew J Schork^{253,254}, Jean Shin²³⁸, Lachlan T Strike^{34,35}, Alexander Teumer²⁵⁵, Marjolein M J van Donkelaar^{1,3}, Kristel R van Eijk²³³, Raymond K Walters^{6,39}, Lars T Westlye^{256,257}, Christopher D Whelan²⁵⁸, Anderson M Winkler²⁵⁹, Marcel P Zwiers³, Saud Alhusaini^{258,260}, Lavinia Athanasiu²¹, Stefan Ehrlich³¹, Marina M H Hakobjan^{1,3}, Cecilie B Hartberg²¹, Unn Haukvik²¹, Angelien J G A M Heister^{1,3}, David Höhn²⁵², Dalia Kasperaviciute^{261,262}, David C M Liewald²⁴⁸, Lorna M Lopez²⁴⁸, Remco R R Makkinje^{1,3}, Mar Matarin²⁶¹, Marlies A M Naber^{1,3}, David R McKay^{263,264}, Margaret Needham⁴⁵, Allison C Nugent²⁴⁶, Benno Pütz²⁵², Natalie A Royle^{235,237,248}, Li Shen^{28,29}, Emma Sprooten¹⁵, Daniah Trabzuni^{251,265}, Saskia S L van der Marel^{1,3}, Kimm J E van Hulzen^{1,3}, Esther Walton³¹, Christiane Wolf²⁵², Laura Almasy²⁶⁶, David Ames^{267,268}, Sampath Arepalli²⁶⁹, Amelia A Assareh²⁴, Mark E Bastin^{235,237,248,270}, Henry Brodaty²⁴, Kazima B Bulayeva²⁷¹, Melanie A Carless²⁶⁶, Sven Cichon^{90,91,125,212}, Aiden Corvin⁴⁵, Joanne E Curran²⁶⁶, Michael Czisch²⁵², Greig I de Zubicaray³⁵, Allissa Dillman²⁶⁹, Ravi Duggirala²⁶⁶, Thomas D Dyer²⁶⁶, Susanne Erk⁸, Iryna O Fedko²⁴¹, Luigi Ferrucci²⁷², Tatiana M Foroud^{29,30}, Peter T Fox²⁷³, Masaki Fukunaga²⁷⁴, Raphael Gibbs^{251,269}, Harald H H Göring²⁶⁶, Robert C Green^{275,276}, Sebastian Guelfi²⁵¹, Narelle K Hansell³⁴, Catharina A Hartman²⁷⁷, Katrin Hegenscheid²⁷⁸, Andreas Heinz⁸, Dena G Hernandez^{251,269}, Dirk J Heslenfeld²⁷⁹, Pieter J Hoekstra²⁷⁷, Florian Holsboer²⁵², Georg Homuth²⁸⁰, Jouke-Jan Hottenga²⁴¹, Masashi Ikeda¹²⁷, Clifford R Jack Jr²⁸¹, Mark Jenkinson²⁸², Robert Johnson²⁸³, Ryota Kanai^{284,285}, Maria Keil²³, Jack W Kent Jr²⁶⁶, Peter Kochunov²⁸⁶, John B Kwok^{287,288}, Stephen M Lawrie¹⁵, Xinmin Liu^{246,289}, Dan L Longo²⁹⁰, Katie L McMahon²⁹¹, Eva Meisenzahl²⁹², Ingrid Melle²², Sebastian Mohnke⁸, Grant W Montgomery³⁴, Jeanette C Mostert^{1,3}, Thomas W Mühleisen²¹², Michael A Nalls²⁶⁹, Thomas E Nichols^{12,13}, Lars G Nilsson²³⁴, Markus M Nöthen^{90,91}, Kazutaka Ohi²⁹³, Rene L Olvera²⁷³, Rocio Perez-Iglesias^{27,177}, G Bruce Pike^{294,295}, Steven G Potkin²⁹⁶, Ivar Reinvang²⁵⁷, Simone Reppermund²⁴, Marcella Rietschel¹⁰⁹, Nina Romanczuk-Seiferth⁸, Glenn D Rosen^{297,298}, Dan Rujescu^{114,115}, Knut Schnell¹⁸⁸, Peter R Schofield^{287,288}, Colin Smith²⁹⁹, Vidar M Steen^{242,243}, Jessika E Sussmann¹⁵, Anbupalam Thalamuthu²⁴, Arthur W Toga³⁰⁰, Bryan Traynor²⁶⁹, Juan Troncoso³⁰¹, Jessica A Turner^{32,33}, Maria C Valdés Hernández²⁷⁰, Dennis van 't Ent²⁴¹, Marcel van der Brug³⁰², Nic J A van der Wee³⁰³, Marie-Jose van Tol³⁰⁴, Dick J Veltman²⁴⁹, Thomas H Wassink³⁰⁵, Eric Westman³⁰⁶, Ronald H Zielke²⁸³, Alan Zonderman³⁰⁷, David G Ashbrook³⁰⁸, Reinmar Hager³⁰⁸, Lu Lu^{309,310}, Francis J McMahon¹⁶, Derek W Morris^{45,96}, Robert W Williams^{309,310}, Han G Brunner^{1,3}, Randy L Buckner^{62,63,64}, Jan K Buitelaar^{3,9}, Wiepke Cahn⁶⁶, Vince D Calhoun^{311,312}, Gianpiero L Cavalleri²⁵⁸, Benedicto Crespo-Facorro^{85,86}, Anders M Dale^{313,314}, Gareth E Davies³¹⁵, Norman Delanty^{258,316}, Chantal Depondt³¹⁷, Srdjan Djurovic^{48,95}, Wayne C Drevets^{246,318}, Thomas Espeseth^{256,257}, Randy L Gollub⁶³, Beng-Choon Ho³¹⁹, Wolfgang Hoffmann^{231,255}, Norbert Hosten²⁷⁸, René S Kahn⁶⁶, Stephanie LeHellard^{242,243}, Andreas Meyer-Lindenberg¹⁷, Bertram Müller-Myhsok^{162–164}, Matthias Nauck³²⁰, Lars Nyberg²³⁴, Massimo Pandolfo³¹⁷, Brenda W J H Penninx²⁴⁹, Joshua L Roffman^{63,64}, Sanjay M Sisodiya²⁶¹, Jordan W Smoller^{7,10,11}, Hans van Bokhoven^{1,3}, Neeltje E M van Haren²³³, Henry Völzke²⁵⁵, Henrik Walter⁸, Michael W Weiner³²¹, Wei Wen²⁴, Tonya White^{322,323}, Ingrid Agartz^{48,49,50}, Ole A Andreassen^{21,22}, John Blangero²⁶⁶, Dorret I Boomsma²⁴¹, Rachel M Brouwer²³³, Dara M Cannon^{246,324}, Mark R Cookson²⁶⁹, Eco J C de Geus²⁴¹, Ian J Deary²⁴⁸, Gary Donohoe^{45,96}, Guillén Fernández^{3,9}, Simon E Fisher³, Clyde Francks³, David C Glahn^{263,264}, Hans J Grabe^{232,325}, Oliver Gruber²³, John Hardy²⁵¹, Ryota Hashimoto³²⁶, Hilleke E Hulshoff Pol²³³, Erik G Jönsson^{48,50}, Iwona Kloszewska³²⁷, Simon Lovestone¹⁸⁴, Venkata S Mattay¹⁹⁵, Patrizia Mecocci³²⁸, Colm McDonald¹⁵⁶, Andrew M McIntosh¹⁵, Roel A Ophoff^{66,73,112}, Tomas Paus^{329,330}, Zdenka Pausova^{238,331}, Mina Ryten^{250,251}, Perminder S Sachdev^{24,25}, Andrew J Saykin^{28–30}, Andy Simmons^{332–334}, Andrew Singleton²⁶⁹, Hilkka Soininen^{335,336}, Joanna M Wardlaw^{235,237,248,270}, Michael E Weale²⁵⁰, Daniel R Weinberger^{195,227}, Hieab H H Adams^{323,337}, Lenore J Launer³³⁸, Stephan Seiler³³⁹, Reinhold Schmidt³³⁹, Ganesh Chauhan³⁴⁰, Claudia L Satizabal^{341,342}, James T Becker^{343–345}, Lisa Yanek³⁴⁶,

Sven J van der Lee³³⁷, Maritza Ebling^{347,348}, Bruce Fischl^{347,348}, W T Longstreth³⁴⁹, Douglas Greve^{347,348}, Helena Schmidt³⁵⁰, Paul Nyquist³⁵¹, Louis N Vinke^{347,348}, Cornelia M van Duijn³³⁷, Xue Luting³⁵², Bernard Mazoyer³⁵³, Joshua C Bis³⁵⁴, Vilmundur Gudnason³⁵⁵, Sudha Seshadri^{341,342}, M Arfan Ikram^{323,337}, Nicholas G Martin^{34,44}, Margaret J Wright^{34,35,44}, Gunter Schumann^{44,228}, Barbara Franke^{1,2,3,44}, Paul M Thompson^{4,44} & Sarah E Medland^{34,44}

¹Department of Human Genetics, Radboud University Medical Center, Nijmegen, the Netherlands. ²Department of Psychiatry, Radboud University Medical Center, Nijmegen, the Netherlands. ³Donders Institute for Brain, Cognition and Behaviour, Raboud University, Nijmegen, the Netherlands. ⁴Imaging Genetics Center, Mark and Mary Stevens Neuroimaging & Informatics Institute, Keck School of Medicine of the University of Southern California, Marina del Rey, California, USA. ⁵Neurogenetics Program, Department of Neurology, UCLA School of Medicine, Los Angeles, California, USA. ⁶Analytic and Translational Genetics Unit, Massachusetts General Hospital, Boston, Massachusetts, USA. 7Stanley Center for Psychiatric Research, Broad Institute of MIT and Harvard, Cambridge, Massachusetts, USA. ⁸Department of Psychiatry and Psychotherapy, Charité Universitätsmedizin Berlin, Campus Charité Mitte, Berlin, Germany. ⁹Department of Cognitive Neuroscience, Radboud University Medical Center, Nijmegen, the Netherlands. ¹⁰Psychiatric and Neurodevelopmental Genetics Unit, Massachusetts General Hospital, Boston, Massachusetts, USA. 11 Department of Psychiatry, Harvard Medical School, Boston, Massachusetts, USA. 12 FMRIB Centre, University of Oxford, Oxford, UK. ¹³Department of Statistics & Warwick Manufacturing Group, University of Warwick, Coventry, UK. ¹⁴Departments of Psychiatry & Human Genetics, Virginia Commonwealth University, Richmond, Virginia, USA. ¹⁵Division of Psychiatry, Royal Edinburgh Hospital, Centre for Cognitive Ageing and Cognitive Epidemiology, University of Edinburgh, Edinburgh, UK. 16 Intramural Research Program, National Institutes of Health, US Department of Health & Human Services, Bethesda, Maryland, USA. ¹⁷Central Institute of Mental Health, Medical Faculty Mannheim, University Heidelberg, Mannheim, Germany. ¹⁸Department of Biomedicine, Aarhus University, Aarhus, Denmark. 19The Lundbeck Foundation Initiative for Integrative Psychiatric Research, iPSYCH, Aarhus and Copenhagen, Denmark. 20Center for integrated Sequencing, iSEQ, Aarhus University, Aarhus, Denmark. 21NORMENT - KG Jebsen Centre, Institute of Clinical Medicine, University of Oslo, Oslo, Norway. ²²Division of Mental Health and Addiction, Oslo University Hospital, Oslo, Norway. ²³Center for Translational Research in Systems Neuroscience and Psychiatry, Department of Psychiatry and Psychotherapy, University Medical Center, Goettingen, Germany. 24Centre for Healthy Brain Ágeing, School of Psychiatry, University of New South Wales (UNSW), Sydney, New South Wales, Australia. 25Neuropsychiatric Institute, Prince of Wales Hospital, Sydney, New South Wales, Australia. ²⁶Department of Psychiatry, University Hospital Marqués de Valdecilla, School of Medicine, University of Cantabria-IDIVAL, Santander, Spain. ²⁷Cibersam (Centro Investigación Biomédica en Red Salud Mental), Madrid, Spain. 28 Center for Neuroimaging, Radiology and Imaging Sciences, Indiana University School of Medicine, Indianapolis, Indiana, USA. 29 Indiana Alzheimer Disease Center, Indiana University School of Medicine, Indianapolis, Indiana, USA. 30 Medical and Molecular Genetics, Indiana University School of Medicine, Indianapolis, Indiana, USA. 31 Department of Child and Adolescent Psychiatry, Faculty of Medicine and University Hospital, Technische Universität Dresden, Dresden, Germany. ³²Georgia State University, Atlanta, Georgia, USA. ³³Mind Research Network, Albuquerque, New Mexico, USA. 34QIMR Berghofer Medical Research Institute, Brisbane, Queensland, Australia. 35School of Psychology, University of Queensland, Brisbane, Queensland, Australia. ³⁶Full lists of members and affiliations appear above. ³⁷MRC Centre for Neuropsychiatric Genetics and Genomics, Institute of Psychological Medicine and Clinical Neurosciences, School of Medicine, Cardiff University, Cardiff, UK. 38 National Centre for Mental Health, Cardiff University, Cardiff, UK. 39 Medical and Population Genetics Program, Broad Institute of MIT and Harvard, Cambridge, Massachusetts, USA. 40 Department of Medical Epidemiology and Biostatistics, Karolinska Institutet, Stockholm, Sweden. 41Department of Genetics, University of North Carolina, Chapel Hill, North Carolina, USA. ⁴²Department of Psychiatry, University of North Carolina, Chapel Hill, North Carolina, USA. ⁴³These authors contributed equally to this work. ⁴⁴These authors jointly directed this work. 45 Neuropsychiatric Genetics Research Group, Department of Psychiatry, Trinity College Dublin, Dublin, Ireland. 46 Eli Lilly and Company Limited, Erl Wood Manor, Sunninghill Road, Windlesham, Surrey, UK. ⁴⁷Social, Genetic and Developmental Psychiatry Centre, Institute of Psychiatry, King's College London, London, UK. 48NORMENT, KG Jebsen Centre for Psychosis Research, Institute of Clinical Medicine, University of Oslo, Oslo, Norway. 49Department of Psychiatry, Diakonhjemmet Hospital, Oslo, Norway. 50 Department of Clinical Neuroscience, Psychiatry Section, Karolinska Institutet, Stockholm, Sweden. 51 State Mental Hospital, Haar, Germany. 52 Department of Psychiatry and Behavioral Sciences, Stanford University, Stanford, California, USA. 53 Department of Psychiatry and Behavioral Sciences, Emory University, Atlanta, Georgia, USA. ⁵⁴Department of Psychiatry and Behavioral Sciences, Atlanta Veterans Affairs Medical Center, Atlanta, Georgia, USA. 55Virginia Institute for Psychiatric and Behavioral Genetics, Virginia Commonwealth University, Richmond, Virginia, USA. 56Clinical Neuroscience, Max Planck Institute of Experimental Medicine, Göttingen, Germany. ⁵⁷Department of Medical Genetics, University of Pécs, Pécs, Hungary. ⁵⁸Szentagothai Research Center, University of Pécs, Pécs, Hungary. 59Department of Psychiatry, University of Iowa Carver College of Medicine, Iowa City, Iowa, USA. 60University Medical Center Groningen, Department of Psychiatry, University of Groningen, the Netherlands. 61School of Nursing, Louisiana State University Health Sciences Center, New Orleans, Louisiana, USA. 62 Center for Brain Science, Harvard University, Cambridge, Massachusetts, USA. 63 Department of Psychiatry, Massachusetts General Hospital, Boston, Massachusetts, USA. 64Athinoula A Martinos Center, Massachusetts General Hospital, Boston, Massachusetts, USA. 65Department of Psychiatry, University of California at San Francisco, San Francisco, California, USA. 66 University Medical Center Utrecht, Department of Psychiatry, Rudolf Magnus Institute of Neuroscience, Utrecht, the Netherlands. ⁶⁷Department of Psychiatry, Icahn School of Medicine at Mount Sinai, New York, New York, USA. ⁶⁸Department of Human Genetics, Icann School of Medicine at Mount Sinai, New York, New York, USA. 69Schizophrenia Research Institute, Sydney, New South Wales, Australia. 70Priority Centre for Translational Neuroscience and Mental Health, University of Newcastle, New South Wales, Australia. 71School of Biomedical Sciences and Pharmacy, University of Newcastle, Callaghan, New South Wales, Australia. 72Centre Hospitalier du Rouvray and INSERM U1079 Faculty of Medicine, Rouen, France. ⁷³Department of Human Genetics, David Geffen School of Medicine, University of California, Los Angeles, California, USA. ⁷⁴School of Psychiatry, University of New South Wales, Sydney, New South Wales, Australia. ⁷⁵Royal Brisbane and Women's Hospital, University of Queensland, Brisbane, Queensland, Australia. ⁷⁶Institute of Psychology, Chinese Academy of Science, Beijing, China. ⁷⁷State Key Laboratory for Brain and Cognitive Sciences, Li Ka Shing Faculty of Medicine. The University of Hong Kong, Hong Kong, China. 78Department of Psychiatry, Li Ka Shing Faculty of Medicine, The University of Hong Kong, Hong Kong, China. 79Department of Computer Science, University of North Carolina, Chapel Hill, North Carolina, USA. 80Castle Peak Hospital, Hong Kong, China. 81 Institute of Mental Health, Singapore, Singapore. 82 Department of Psychiatry, Washington University, St. Louis, Missouri, USA. 83 Department of Child and Adolescent Psychiatry, Assistance Publique Hospitaux de Paris, Pierre and Marie Curie Faculty of Medicine and Institute for Intelligent Systems and Robotics, Paris, France. 84Blue Note Biosciences, Princeton, New Jersey, USA. ⁸⁵Department of Psychiatry, University Hospital Marqués de Valdecilla, School of Medicine, University of Cantabria-IDIVAL, Santander, Spain. ⁸⁶Centro Investigacion Biomedica en Red Salud Mental, Madrid, Spain. ⁸⁷Department of Psychological Medicine, Queen Mary University of London, London, UK. 88 Molecular Psychiatry Laboratory, Division of Psychiatry, University College London, London, UK. 89 Sheba Medical Center, Tel Hashomer, Israel. 90 Institute of Human Genetics, University of Bonn, Bonn, Germany. 91 Department of Genomics, Life and Brain Center, Bonn, Germany. 92 Applied Molecular Genomics Unit, VIB Department of Molecular Genetics, University of Antwerp, Antwerp, Belgium. 93First Department of Psychiatry, University of Athens Medical School, Athens, Greece. 94Department of Psychiatry, University College Cork, County Cork, Ireland. 95Department of Medical Genetics, Oslo University Hospital, Oslo, Norway. 96Cognitive Genetics and Therapy Group, School of Psychology and Discipline of Biochemistry, National University of Ireland Galway, County Galway, Ireland. 97Department of Psychiatry and Behavioral Sciences, NorthShore University HealthSystem, Evanston, Illinois, USA. 98 Department of Psychiatry and Behavioral Neuroscience, University of Chicago, Chicago, Chicago, Illinois, USA. ⁹⁹Department of Non-Communicable Disease Epidemiology, London School of Hygiene and Tropical Medicine, London, UK. 100 Department of Psychiatry, University of Regensburg, Regensburg, Germany. 101 Folkhälsan Research Center, Helsinki, Finland, Biomedicum Helsinki, Helsinki, Finland. 102National Institute for Health and Welfare, Helsinki, Finland. 103Department of General Practice, Helsinki University Central Hospital, University of Helsinki, Helsinki, Finland. 104Translational Technologies and Bioinformatics, Pharma Research and Early Development, F. Hoffman-La Roche, Basel, Switzerland. 105Mental Health Service Line, Washington Veterans Affairs Medical Center, Washington, DC, USA. 106Department of Psychiatry, Georgetown University School of Medicine, Washington, DC, USA. ¹⁰⁷Department of Psychiatry, Virginia Commonwealth University School of Medicine, Richmond, Virginia, USA. ¹⁰⁸Department of

Psychiatry, Keck School of Medicine of the University of Southern California, Los Angeles, California, USA. 109 Department of Genetic Epidemiology in Psychiatry,





Central Institute of Mental Health, Medical Faculty Mannheim, University of Heidelberg, Heidelberg, Mannheim, Germany. 110 Department of Genetics, University of Groningen, University Medical Centre Groningen, Groningen, the Netherlands. 111 Department of Psychiatry, University of Colorado Denver, Aurora, Colorado, USÁ. 112Center for Neurobehavioral Genetics, Semel Institute for Neuroscience and Human Behavior, University of California, Los Angeles, California, USA. 113Departments of Psychiatry and Human Genetics, University of Chicago, Chicago, Illinois, USA. 114 Department of Psychiatry, University of Halle, Germany. 115 Department of Psychiatry, University of Munich, Munich, Germany. ¹¹⁶Departments of Psychiatry and Human and Molecular Genetics, INSERM, Institut de Myologie, Hôpital de la Pitiè-Salpêtrière, Paris, France. ¹¹⁷Neuroscience Therapeutic Area, Janssen Research and Development, Raritan, New Jersey, USA. ¹¹⁸Queensland Brain Institute, The University of Queensland, Brisbane, Queensland, Australia. 119 Academic Medical Centre University of Amsterdam, Department of Psychiatry, Amsterdam, the Netherlands. 120 Illumina, La Jolla, California, California, USA. 121 JJ Peters Veterans Affairs Medical Center, Bronx, New York, New York, USA. 122 Friedman Brain Institute, Icahn School of Medicine at Mount Sinai, New York, New York, USA. 123School of Electrical Engineering and Computer Science, University of Newcastle, New South Wales, Australia. 124 Priority Research Centre for Health Behaviour, University of Newcastle, Newcas Clinical Biochemistry, Immunology and Genetics, Statens Serum Institut, Copenhagen, Denmark. 127 Department of Psychiatry, Fujita Health University School of Medicine, Toyoake, Aichi, Japan. ¹²⁸Regional Centre for Clinical Research in Psychosis, Department of Psychiatry, Stavanger University Hospital, Stavanger, Norway. ¹²⁹Rheumatology Research Group, Vall d'Hebron Research Institute, Barcelona, Spain. ¹³⁰Centre for Medical Research, The University of Western Australia, Perth, Western Australia, Australia, 131The Perkins Institute for Medical Research, The University of Western Australia, Perth, Western Australia, Australia, 132Department of Medical Genetics, Medical University, Sofia, Bulgaria. 133 Department of Psychology, University of Colorado Boulder, Boulder, Colorado, USA. 134 Campbell Family Mental Health Research Institute, Centre for Addiction and Mental Health, Toronto, Ontario, Canada. 135Department of Psychiatry, University of Toronto. Toronto. Ontario, Canada. 136 Institute of Medical Science, University of Toronto, Toronto, Ontario, Canada. 137 Institute of Molecular Genetics, Russian Academy of Sciences, Moscow, Russia. 138 Latvian Biomedical Research and Study Centre, Riga, Latvia. 139 Department of Psychiatry and Zilkha Neurogenetics Institute, Keck School of Medicine at University of Southern California, Los Angeles, California, USA. 140 Faculty of Medicine, Vilnius University, Vilnius, Lithuania. 141 Department of Biology and Medical Genetics, 2nd Faculty of Medicine and University Hospital Motol, Prague, Czech Republic. 142 Department of Child and Adolescent Psychiatry, Pierre and Marie Curie Faculty of Medicine, Paris, France. 143 Duke-National University Singapore Graduate Medical School, Singapore, Singapore. 144 Department of Psychiatry, Hadassah-Hebrew University Medical Center, Jerusalem, Israel. 145Centre for Genomic Sciences, The University of Hong Kong, Hong Kong, China. 146Mental Health Centre and Psychiatric Laboratory, West China Hospital, Sichuan University, Chengdu, Sichuan, China. 147Department of Biostatistics, Johns Hopkins University Bloomberg School of Public Health, Baltimore, Maryland, USA. 148 Department of Psychiatry, Columbia University, New York, New York, USA. 149 Department of Mental Health and Substance Abuse Services, National Institute for Health and Welfare, Helsinki, Finland. 150Department of Genetics and Pathology, International Hereditary Cancer Center, Pomeranian Medical University in Szczecin, Szczecin, Poland. 151 Department of Biology and Medical Genetics, 2nd Faculty of Medicine and University Hospital Motol, Prague, Czech Republic. 152Department of Mental Health, Bloomberg School of Public Health, Johns Hopkins University, Baltimore, Maryland, USA. ¹⁵³Department of Psychiatry, University of Bonn, Bonn, Germany. ¹⁵⁴Centre National de la Recherche Scientifique, Laboratoire de Génétique Moléculaire de la Neurotransmission et des Processus Neurodégénératifs, Hôpital de la Pitié Salpêtrière, Paris, France. 155Research Unit, Sørlandet Hospital, Kristiansand, Norway. 156Department of Psychiatry, National University of Ireland Galway, County Galway, Ireland. 157Department of Genetic Epidemiology in Psychiatry, Central Institute of Mental Health, Medical Faculty Mannheim, University of Heidelberg, Heidelberg, Mannheim, Germany. 158 Estonian Genome Center, University of Tartu, Tartu, Estonia. 159School of Psychology, University of Newcastle, Newcastle, New South Wales, Australia. 160First Psychiatric Clinic, Medical University, Sofia, Bulgaria. 161 Eli Lilly and Company Limited, Windlesham, Surrey, UK. 162 Max Planck Institute of Psychiatry, Munich, Germany. 163 Institute of Translational Medicine, University of Liverpool, Liverpool, UK. 164 Munich Cluster for Systems Neurology (SyNergy), Munich, Germany. 165 Department of Psychiatry, Royal College of Surgeons in Ireland, Dublin, Ireland. 166King's College London, London, UK. 167Maastricht University Medical Centre, South Limburg Mental Health Research and Teaching Network, EURON, Maastricht, the Netherlands. ¹⁶⁸Department of Psychiatry and Psychotherapy, Jena University Hospital, Jena, Germany. ¹⁶⁹Queensland Centre for Mental Health Research, University of Queensland, Brisbane, Queensland, Australia. ¹⁷⁰Department of Psychiatry and Behavioral Sciences, Johns Hopkins University School of Medicine, Baltimore, Maryland, USA. 171 Department of Psychiatry, Trinity College Dublin, Dublin, Ireland. 172 Eli Lilly and Company, Lilly Corporate Center, Indianapolis, Indiana, USA. 173 Department of Clinical Sciences, Psychiatry, Umeå University, Umeå, Sweden. 174 DETECT Early Intervention Service for Psychosis, Blackrock, County Dublin, Ireland. 175Centre for Public Health, Institute of Clinical Sciences, Queen's University Belfast, UK. 176Lawrence Berkeley National Laboratory, University of California at Berkeley, Berkeley, California, USA. ¹⁷⁷Institute of Psychiatry, King's College London, London, UK. ¹⁷⁸Melbourne Neuropsychiatry Centre, University of Melbourne & Melbourne Health, Melbourne, Victoria, Australia. 179 Public Health Genomics Unit, National Institute for Health and Welfare, Helsinki, Finland. 180 Department of Psychiatry, University of Helsinki, Helsinki, Finland. 181 Psychosis Endophenotypes International Consortium. London, UK. ¹⁸²Institute for Molecular Medicine Finland, FIMM, University of Helsinki, Helsinki, Finland. ¹⁸³Division of Psychiatric Genomics, Department of Psychiatry, Icahn School of Medicine at Mount Sinai, New York, USA. ¹⁸⁴Department of Psychiatry, University of Oxford, Oxford, UK. ¹⁸⁵Institute for Multiscale Biology, Icahn School of Medicine at Mount Sinai, New York, New York, USA. 186 Department of Psychiatry and Behavioral Neuroscience, University of Chicago, Chicago, Illinois, USA. 187 PharmaTherapeutics Clinical Research, Pfizer Worldwide Research and Development, Cambridge, Massachusetts, USA. 188Department of Psychiatry and Psychotherapy, University of Gottingen, Gottingen, Germany. 189Psychiatry and Psychotherapy Clinic, University of Erlangen, Erlangen, Germany. 190 Hunter New England Health Service, Newcastle, New South Wales, Australia. 191 Division of Cancer Epidemiology and Genetics, National Cancer Institute, Bethesda, Maryland, USA. 192Research and Development, Bronx Veterans Affairs Medical Center, New York, New York, USA. 193Wellcome Trust Centre for Human Genetics, Oxford, UK. 194Department of Clinical Neurology, Medical University of Vienna, Vienna, Austria. 195Lieber Institute for Brain Development, Baltimore, Maryland, USA. 196 Department of Medical Genetics, University Medical Centre Utrecht, Utrecht, the Netherlands. 197 Berkshire Healthcare NHS Foundation Trust, Bracknell, UK. 198Department of Medical Genetics, Medical University, Sofia, Bulgaria. 199Priority Research Centre for Translational Neuroscience and Mental Health, University of Newcastle, Newcastle, New South Wales, Australia. 200 Department of Psychiatry, University of Oulu, Oulu, Finland. ²⁰¹University Hospital of Oulu, Oulu, Finland. ²⁰²Molecular and Cellular Therapeutics, Royal College of Surgeons in Ireland, Dublin, Ireland. ²⁰³Health Research Board, Dublin, Ireland. 204Mental Health Centre and Psychiatric Laboratory, West China Hospital, Sichuan University, Chendu, Sichuan, China. 205School of Psychiatry and Clinical Neurosciences, The University of Western Australia, Perth, Western Australia, Australia. 206Computational Sciences CoE, Pfizer Worldwide Research and Development, Cambridge, Massachusetts, USA, 207 Human Genetics, Genome Institute of Singapore, A*STAR, Singapore, Singapore, 208 Wellcome Trust Case Control Consortium 2. 209 Division of Psychiatry, University of Edinburgh, Edinburgh, UK. 210 University College London, London, UK. 211 Department of Neuroscience, Icahn School of Medicine at Mount Sinai, New York, New York, USA. 212 Institute of Neuroscience and Medicine (INM-1), Research Center Juelich, Juelich, Germany. 213 Department of Genetics, The Hebrew University of Jerusalem, Jerusalem, Israel. 214 Neuroscience Discovery and Translational Area, Pharma Research and Early Development, F. Hoffman-La Roche, Basel, Switzerland. 215School of Psychiatry and Clinical Neurosciences, The University of Western Australia, Perth, Western Australia, Australia. ²¹⁶Centre for Clinical Research in Neuropsychiatry, School of Psychiatry and Clinical Neurosciences, The University of Western Australia, Medical Research Foundation Building, Perth, Western Australia, Australia. ²¹⁷The Perkins Institute for Medical Research, The University of Western Australia, Perth, Western Australia, Australia. 218The Zucker Hillside Hospital, Glen Oaks, New York, USA. 219The Feinstein Institute for Medical Research, Manhasset, New York, USA. 220The Hofstra North Shore-Long Island Jewish School of Medicine, Hempstead, New York, USA. 221Saw Swee Hock School of Public Health, National University of Singapore, Si ²²³Department of Functional Genomics, Center for Neurogenomics and Cognitive Research, Neuroscience Campus Amsterdam, VU University, Amsterdam, the Netherlands. 224 Department of Complex Trait Genetics, Neuroscience Campus Amsterdam, VU University Medical Center Amsterdam, Amsterdam, the Netherlands. ²²⁵Department of Child and Adolescent Psychiatry, Erasmus University Medical Centre, Rotterdam, the Netherlands. ²²⁶University of Aberdeen, Institute of Medical Sciences, Aberdeen, UK. 227 Departments of Psychiatry, Neurology, Neuroscience and Institute of Genetic Medicine, Johns Hopkins School of Medicine, Baltimore, Maryland, USA. ²²⁸MRC-SGDP Centre, Institute of Psychiatry, King's College London, London, UK. ²²⁹Imaging Genetics Center, Institute for Neuroimaging & Informatics, Keck School of Medicine of the University of Southern California, Los Angeles, USA. ²³⁰Institut Pasteur, Paris, France. ²³¹German Center for Neurodegenerative Diseases (DZNE) Rostock/Greifswald, Greifswald, Germany. ²³²Department of Psychiatry, University Medicine Greifswald, Greifswald, Germany. ²³³Brain Center Rudolf Magnus, Department of Psychiatry, UMC Utrecht, Utrecht, the Netherlands. ²³⁴Umeå Centre for Functional Brain Imaging (UFBI), Umeå University, Umeå, Sweden. ²³⁶Brain Research Imaging Centre, University of Edinburgh, Edinburgh, UK. ²³⁶Department of Computer Science, Lagos State University, Lagos, Nigeria. 237 Scottish Imaging Network, A Platform for Scientific Excellence (SINAPSE) Collaboration, Department of Neuroimaging Sciences,



University of Edinburgh, Edinburgh, UK. ²³⁸Hospital for Sick Children, University of Toronto, Toronto, Ontario, Canada. ²³⁹Cerebral Imaging Centre, Douglas Mental Health University Institute, Montreal, Quebec, Canada. ²⁴⁰Department of Psychiatry and Biomedical Engineering, McGill University, Montreal, Quebec, Canada. ²⁴¹Biological Psychology, Neuroscience Campus Amsterdam, VU University & VU Medical Center, Amsterdam, the Netherlands. ²⁴²NORMENT – KG Jebsen Centre for Psychosis Research, Department of Clinical Science, University of Bergen, Bergen, Norway. 243 Dr Einar Martens Research Group for Biological Psychiatry, Center for Medical Genetics and Molecular Medicine, Haukeland University Hospital, Bergen, Norway. 244 Language and Genetics Department, Max Planck Institute for Psycholinguistics, Nijmegen, the Netherlands. ²⁴⁶National Institute of Mental Health Intramural Research Program, Bethesda, Maryland, USA. 247 Center for Neurobehavioral Genetics, University of California, Los Angeles, California, USA. ²⁴⁸Centre for Cognitive Ageing and Cognitive Epidemiology, Psychology, University of Edinburgh, Edinburgh, UK. ²⁴⁹Department of Psychiatry, Neuroscience Campus Amsterdam, VU University Medical Center, Amsterdam, the Netherlands. 250 Department of Medical and Molecular Genetics. King's College London, London, UK. ²⁵¹Reta Lila Weston Institute and Department of Molecular Neuroscience, UCL Institute of Neurology, London, UK. ²⁵²Max Planck Institute of Psychiatry, Munich, Germany. ²⁵³Multimodal Imaging Laboratory, Department of Neurosciences, University of California, San Diego, California, USA. ²⁵⁴Department of Cognitive Sciences, University of California, San Diego, California, USA. 255 Institute for Community Medicine, University Medicine Greifswald, Greifswald, Germany. NORMENT – KG Jebsen Centre, Division of Mental Health and Addiction, Oslo University Hospital, Oslo, Norway. 257 NORMENT – KG Jebsen Centre, Department of Psychology, University of Oslo, Oslo, Norway. ²⁵⁸Molecular and Cellular Therapeutics, The Royal College of Surgeons, Dublin, 2, Ireland. ²⁵⁹The Oxford Center for Functional MRI of the Brain, Nuffield Department of Clinical Neurosciences, Oxford University, Oxford, UK. 260Department of Neurology and Neurosurgery, Montreal Neurological Institute, McGill University, Montreal, Quebec, Canada. 261 UCL Institute of Neurology, University College London, and Epilepsy Society, London, UK. ²⁶²Department of Medicine, Imperial College London, UK. ²⁶³Department of Psychiatry, Yale University, New Haven, Connecticut, USA. ²⁶⁴Olin Neuropsychiatric Research Center, Hartford, Connecticut, USA. ²⁶⁵Department of Genetics, King Faisal Specialist Hospital and Research Centre, Riyadh, Saudi Arabia. 266 Texas Biomedical Research Institute, San Antonio, Texas, USA. 267 National Ageing Research Institute, Royal Melbourne Hospital, Melbourne, Victoria, Australia, 268 Academic Unit for Psychiatry of Old Age, University of Melbourne, Melbourne, Victoria, Australia, 269 Laboratory of Neurogenetics, National Institute on Aging, National Institutes of Health, Bethesda, Maryland, USA. 270Centre for Clinical Brain Sciences, University of Edinburgh, Edinburgh, UK. 271NI Vavilov Institute of General Genetics, Russian Academy of Sciences, Moscow, Russia. 272 Clinical Research Branch, National Institute on Aging, Baltimore, Maryland, USA. ²⁷³University of Texas Health Science Center, San Antonio, USA. ²⁷⁴Biofunctional Imaging, Immunology Frontier Research Center, Osaka University, Osaka, Japan. 275 Harvard Medical School, Cambridge, Massachusetts, USA. 276 Division of Genetics, Department of Medicine, Brigham and Women's Hospital, Boston, Massachusetts, USA. 277 Department of Psychiatry, University of Groningen, University Medical Center Groningen, Groningen, the Netherlands. 278 Institute of Diagnostic Radiology and Neuroradiology, University Medicine Greifswald, Greifswald, Germany. 279 Department of Psychology, VU University Amsterdam, Amsterdam, the Netherlands. 280 Interfaculty Institute for Genetics and Functional Genomics, University Medicine Greifswald, Greifswald, Germany. 281 Radiology, Mayo Clinic, Rochester, Minnesota, USA. 282 FMRIB Centre, University of Oxford, Oxford, UK. 283 NICHD Brain and Tissue Bank for Developmental Disorders, University of Maryland Medical School, Baltimore, Maryland, USA. ²⁸⁴School of Psychology, University of Sussex, Brighton, UK. ²⁸⁵Institute of Cognitive Neuroscience, University of Sussex, Brighton, UK. ²⁸⁶Department of Psychiatry, University of Maryland, Catonsville, Maryland, USA. ²⁸⁷Neuroscience Research Australia, Sydney, New South Wales, Australia. ²⁸⁸School of Medical Sciences, University of New South Wales, Sydney, New South Wales, Australia. ²⁸⁹Columbia University Medical Center, New York, USA. 290 Lymphocyte Cell Biology Unit, Laboratory of Immunology, National Institute on Aging, National Institutes of Health, Baltimore, Maryland, USA. ²⁹¹Centre for Advanced Imaging, University of Queensland, Brisbane, Queensland, Australia. ²⁹²Ludwig-Maximilians-Universität, Munich, Germany. ²⁹³Department of Psychiatry, Osaka University Graduate School of Medicine, Osaka, Japan. 294 Department of Neurology, University of Calgary, Canada. 295 Department of Clinical Neuroscience, University of Calgary, Calgary, Canada. 296 Psychiatry and Human Behavior, University of California, Irvine, California, USA. 297 Beth Israel Deaconess Medical Center, Boston, Massachusetts, USA. 298Department of Neurology, Harvard Medical School, Boston, Massachusetts, USA. 299Department of Neuropathology, MRC Sudden Death Brain Bank Project, University of Edinburgh, Edinburgh, UK. 300 Laboratory of Neuro Imaging, Institute for Neuroimaging and Informatics, Keck School of Medicine of the University of Southern California, Los Angeles, California, USA. 301 Brain Resource Center, Johns Hopkins University, Baltimore, Maryland, USA. 302The Scripps Research Institute, Jupiter, Florida, USA. 303Leiden University Medical Center, Leiden, the Netherlands. 304Neuroimaging Centre, University of Groningen, University Medical Center Groningen, Groningen, the Netherlands. 305Department of Psychiatry, Carver College of Medicine, University of Iowa, Iowa City, Iowa, USA. 306Department of Neurobiology, Care Sciences and Society, Karolinska Institutet, Stockholm, Sweden. 307Research Resources Branch, National Institute on Aging, National Institutes of Health, Bethesda, Maryland, USA. 308Faculty of Life Sciences, University of Manchester, Manchester, UK, 309Center for Integrative and Translational Genomics, University of Tennessee Health Science Center, Memphis, Tennessee, USA, 310Department of Anatomy and Neurobiology, University of Tennessee Health Science Center, Memphis, Tennessee, USA. 311The Mind Research Network & LBERI, Albuquerque, New Mexico, USA. 312Department of ECE, University of New Mexico, Albuquerque, New Mexico, USA. 313Center for Translational Imaging and Personalized Medicine, University of California, San Diego, California, USA. 314 Departments of Neurosciences, Radiology, Psychiatry, and Cognitive Science, University of California, San Diego, California, USA. 315 Avera Institute for Human Genetics, Sioux Falls, South Dakota, USA. 316 Neurology Division, Beaumont Hospital, Dublin, Ireland. 317 Department of Neurology, Hopital Erasme, Universite Libre de Bruxelles, Brussels, Belgium. 318 Janssen Research & Development, Johnson & Johnson. Raritan, New Jersey, USA. 319 Department of Psychiatry, University of Iowa, Iowa City. Iowa, USA. 320 Institute of Clinical Chemistry and Laboratory Medicine, University Medicine Greifswald, Greifswald, Germany. 321Center for Imaging of Neurodegenerative Disease, San Francisco Veterans Affairs Medical Center, University of California, San Francisco, USA. 322Department of Child Psychiatry, Erasmus University Medical Centre, Rotterdam, the Netherlands. 323Department of Radiology, Erasmus University Medical Centre, Rotterdam, the Netherlands. 324Clinical Neuroimaging Laboratory, College of Medicine, Nursing and Health Sciences, National University of Ireland Galway, Galway, Ireland. ³²⁵Department of Psychiatry and Psychotherapy, HELIOS Hospital Stralsund, Stralsund, Germany. ³²⁶Molecular Research Center for Children's Mental Development, United Graduate School of Child Development, Osaka University, Osaka, Japan. 327 Medical University of Lodz, Lodz, Poland. 328 Section of Gerontology and Geriatrics, Department of Medicine, University of Perugia, Perugia, Italy. 329Rotman Research Institute, University of Toronto, Toronto, Ontario, Canada. 330Departments of Psychology and Psychiatry, University of Toronto, Ontario, Canada. 331Departments of Physiology and Nutritional Sciences, University of Toronto, Ontario, Canada. 332Department of Neuroimaging, Institute of Psychiatry, King's College London, London, UK. 333Biomedical Research Centre for Mental Health, King's College London, London, UK. 334Biomedical Research Unit for Dementia, King's College London, London, UK. 335Institute of Clinical Medicine, Neurology, University of Eastern Finland, Kuopio, Finland. 336 Neurocentre Neurology, Kuopio University Hospital, Kuopio, Finland. 337 Department of Epidemiology, Erasmus University Medical Centre, Rotterdam, the Netherlands. 338 Laboratory of Epidemiology and Population Sciences, Intramural Research Program, National Institute on Aging, Bethesda, Maryland, USA. ³³⁹Department of Neurology, Clinical Division of Neurogeriatrics, Medical University Graz, Graz, Austria. ³⁴⁰INSERM U897, University of Bordeaux, Bordeaux, France. 341Department of Neurology, Boston University School of Medicine, Boston, Massachusetts, USA. 342Framingham Heart Study, Framingham, Massachusetts, USA. 343Department of Neurology, School of Medicine, University of Pittsburgh, Pittsburgh, Pennsylvania, USA. 344Department of Psychiatry, School of Medicine, University of Pittsburgh, Pennsylvania, USA. 345Department of Psychology, School of Medicine, University of Pittsburgh, Pittsburgh, Pittsburgh, Pittsburgh, Pittsburgh, Pittsburgh, Pittsburgh, Pittsburgh, Pittsburgh, USA. 346General Internal Medicine, Johns Hopkins School of Medicine, Baltimore, Maryland, USA. 347 Martinos Center for Biomedical Imaging, Massachusetts General Hospital, Charlestown, Massachusetts, USA. 348 Department of Radiology, Massachusetts General Hospital, Harvard Medical School, Boston, Massachusetts, USA, 349 Department of Neurology University of Washington, Seattle, Washington, USA. 350 Institute of Molecular Biology and Biochemistry, Medical University Graz, Graz, Austria. 351 Department of Neurology, Johns Hopkins University School of Medicine, Baltimore, Maryland, USA. 352 Department of Biostatistics, Boston University School of Public Health, Boston, Massachuestts, USA. 353 UMR5296, Centre d'études scientifiques et techniques d'Aquitaine and University of Bordeaux, Bordeaux, France. 354 Cardiovascular Health Research Unit, Department of Medicine, University of Washington, Seattle, Washington, USA. 355 Icelandic Heart Association, Kopavogur, University of Iceland, Faculty of Medicine, Reykjavik, Iceland. Correspondence should be addressed to B.F. (barbara.franke@radboudumc.nl) or P.F.S. (pfsulliv@med.unc.edu).

ONLINE METHODS

Data. The data used for the analyses described here are available to researchers. The ENIGMA data can be obtained from http://enigma.ini.usc.edu/enigma-vis/. The PGC data can be downloaded from http://www.med.unc.edu/pgc/downloads/.

PGC schizophrenia. We analyzed individual genotype data from 46 Europeanancestry schizophrenia GWAS data sets (full details in ref. 3). Briefly, quality control and imputation were performed by the PGC Statistical Analysis Group for each data set separately. Genotype imputation was with the pre-phasing/ imputation stepwise approach implemented in IMPUTE2/SHAPEIT (chunk size of 3 Mb and default parameters) using the 1000 Genomes Project data set (phase 1, August 2012, URLs). After imputation, we identified autosomal SNPs with high imputation accuracy across all samples. For robust relatedness testing and population structure analysis, we evaluated a subset of SNPs following LD-pruning ($r^2 > 0.02$) and frequency filtering (MAF > 0.05). For association testing, we evaluated the 46 data sets separately using an additive logistic regression model including ancestry principal components as covariates, and then conducted a meta-analysis of the 52 sets of results using an inverseweighted fixed effects model. After excluding subjects who were also in ENIGMA (N = 458; see below), 33,636 cases and 43,008 controls were used for calculations(Supplementary Table 1).

ENIGMA, sample with brain volume measures and assessment of endophenotype. The data analyzed here are from the ENIGMA analysis of eight MRI volumetric measures (full details in ref. 9). MRI brain scans and genome-wide genotype data were available for 11,840 subjects from 22 cohorts (Supplementary Table 1). Only cohorts without schizophrenia cases and controls overlapping with the PGC schizophrenia samples were included. Participants clustered with subjects of known European ancestry as verified by multidimensional scaling (MDS) analysis. Genomic data were imputed to a reference panel (1000 Genomes, v3 phase1) comprising only European samples and with monomorphic SNPs removed. Imputation was performed at each site using MaCH for phasing and minimac for imputation³⁴. Only SNPs with an imputation score of RSQ > 0.5 and minor allele counts > 10 within each site were included. Tests of association were conducted separately for eight MRI volumetric phenotypes (nucleus accumbens, amygdala, caudate nucleus, hippocampus, pallidum, putamen, thalamus and ICV) with the following covariates in a multiple linear regression framework: age, age2, sex, four MDS components (to account for population structure), ICV (for subcortical brain phenotypes) and diagnosis (when applicable). The GWA statistics from each of the 22 sites were combined using a fixed-effect inverse variance-weighted meta-analysis as implemented in METAL35.

Removal of duplicated individuals. Subject overlap between all PGC and ENIGMA cohorts was evaluated using a checksum algorithm to ensure the robustness of our results, given that some analyses were sensitive to the presence of duplicate individuals. For each individual, ten checksum numbers were created based on ten batches of 50 SNP genotypes and compared between individuals from both consortia. Based on these comparisons and a general exclusion of cohorts containing schizophrenia cases, 1,517 individuals were removed from ENIGMA and 458 subjects were removed from the PGC.

Linkage disequilibrium score regression (LDSR). For LDSR, each data set underwent additional filtering. Only markers overlapping with HapMap Project Phase 3 SNPs and passing the following filters were included: INFO score > 0.9 (where available), study missingness of 0 and MAF > 1%. Indels and strandambiguous SNPs were removed. To remove a potential source of bias, all SNPs in the extended MHC region (chr6:25–35 Mb) were removed from all data sets. The schizophrenia analysis included only results from European studies used (LDSR requires linkage disequilibrium (LD) data from a comparable sample). For the ENIGMA amygdala results, the mean χ^2 was too low (1.0051) to reliably estimate heritability using LDSR.

The analysis was conducted using a two-step procedure with the LD-scoring analysis package $^{12,14}. \ An \ unconstrained \ regression \ was \ run \ to \ estimate the regression intercepts for each phenotype, followed by an analysis with regression intercepts constrained to those estimated in the first step and the covariance$

intercept defined as zero (we took steps to exclude overlapping samples). Standard errors were estimated using a block jackknife procedure and used to calculate *P*-values.

Genetic predisposition analyses. To investigate the combined impact of ENIGMA association results on case-control status in the PGC schizophrenia data, we performed a series or genetic predisposition score analyses. For each ENIGMA volumetric phenotypes, we excluded SNPs with MAF <2%, indels and SNPs in the extended MHC region (chr6:25-34 Mb). We then 'clumped' the data, discarding variants within 500 kb of and in $r^2 \ge 0.1$ with another, more significant marker. We performed genetic predisposition score prediction of target subgroups as originally described 15 for several P-value thresholds (5 × 10⁻⁸, 1×10^{-6} , 1×10^{-4} , 0.001, 0.01, 0.05, 0.1, 0.2, 0.5, 1.0), multiplying the effect size of the ENIGMA phenotype of each variant by the imputation probability for the risk allele in each individual. The resulting values were summed so that each individual had a genetic predisposition score for further analyses. Two outcome variables are reported in Table 2: the significance of the case-control score difference analyzed by logistic regression (including ancestry-based principal components and a study indicator as covariates) and the proportion of variance explained (Nagelkerke's R^2) computed by comparison of a full model (covariates + polygenic risk scores) score to a reduced model (covariates only). Note that these R^2 estimates are biased owing to recruitment of the case-control studies and as the numbers of cases and controls do not reflect the underlying risk of disease in the population.

Rank-rank-hypergeometric overlap test (RRHO). RRHO)¹⁷ tests the hypothesis that ordering of two lists (LD-pruned GWAS results for schizophrenia versus a brain structure phenotype) by the strength of their association is arbitrary. The number of independent SNPs in common between the two ordered lists is evaluated at specified step sizes. Two lists that show similar ordering of SNPs demonstrate a global pattern of similarity of associations. Independent SNPs were selected on the basis of the 1000 Genomes European data set for 200 SNP windows shifted at five SNP intervals using an r^2 threshold of 0.25. SNPs found in both PGC and ENIGMA data with MAF ≥ 0.01 were retained (172,652 SNPs). The SNPs were then ordered by the $-\log_{10}P$ of association multiplied by the effect size. A two-sided RRHO test that allowed testing for either over- or underenrichment was used with a step size of 3,000 SNPs.

Finger whorl data used as control in conjunction analysis. A GWAS of a dermatoglyphic trait (presence of a whorl on the left thumb), collected as part of an ongoing study at the Queensland Institute of Medical Research¹⁸, was used to provide a negative control for the RRHO test. Briefly, rolled ink prints were collected on archival quality paper, and fingerprint patterns were manually coded. Complete data from 3,314 participants (twins and their family members) were available. Genotypes were imputed to the 1000 Genomes Project reference (phase 1 version 3). GWAS was conducted using Merlin offline to account for relatedness and zygosity.

Lookup of top GWAS SNP findings. Evidence for an effect of the reported 128 independent schizophrenia-associated SNPs on subcortical brain volumes and ICV was studied through a look-up of results. rs115329265 was not available in the ENIGMA data and was replaced by a SNP in moderate LD (chr6:28305863R; $r^2 = 0.64$); rs77149735 was not available in ENIGMA and could not be replaced by a SNP in LD. Three chrX SNPs (rs1378559, rs5937157 and rs12845396) were excluded because chrX data were not available from ENIGMA. Effects of the eight independent SNPs associated with brain volumes reported by ENIGMA on schizophrenia risk were studied through look-up of results in the PGC data.

Multiple-comparisons correction was performed by estimating the effective number of independent tests ($M_{\rm eff}$). This method considers the correlation structure (**Supplementary Table 4**) between brain measures and calculates the $M_{\rm eff}$ based on the observed eigenvalue variance of the different brain volume measures using matSpD (http://gump.qimr.edu.au/general/daleN/matSpD/). The P value for significance was 0.05 divided by the sum of (a) $M_{\rm eff}$ times the number of SNPs included in the lookup from PGC to ENIGMA (n = 124) and (b) the number of SNPs included in the lookup from ENIGMA to PGC (n = 8). Eight brain volumes resulted in seven independent tests, and only SNPs with a P < 5.7 × 10⁻⁵ were considered significant.

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SNP sign test in the top GWAS findings. To investigate a potential accumulation of same- or opposite-direction effects of SNPs between PGC schizophrenia and ENIGMA, we counted the number of same direction effects for the top findings from the schizophrenia data set (94 LD-independent genome-wide significant SNPs, 231 with $P < 1 \times 10^{-6}$) in the different brain structure data sets and tested the significance of the result in a binomial test (n = 14 tests for 7 effective ENIGMA phenotypes and 2 P-value thresholds).

Conjunction analysis. To determine whether a particular SNP is linked to both brain structure and risk for schizophrenia, we used a conjunction analysis 19 . This analysis makes inference on the alternative hypothesis that both null hypotheses are false. This is in distinction to a traditional meta-analysis method which infers on an alternative hypothesis that one or more null hypotheses are false. A conjunction analysis is calculated as $P_{\rm conj} = {\rm max}(P_{\rm brain}, P_{\rm case-control}),$ where $P_{\rm brain}$ is the significance of the SNP associated to brain structure and $P_{\rm case-control}$ is the significance of the SNP association to schizophrenia. As conjunction tests can be very conservative, an adjustment to this test 36 based on the estimated fraction of false nulls was used here with modifications $(P'_{\rm conj})$. Over 7.5 million SNPs found in both the ENIGMA and PGC data sets with MAF ≥ 0.01 were evaluated.

A conjunction null hypothesis is the union of the individual null hypotheses, producing a 'composite null hypothesis'. In standard testing situations a 'point null hypothesis' is used, meaning that there is exactly one configuration of the unknown parameters of interest that corresponds to the null. For example, "no gene-brain association, no case-control association" is a point null hypothesis. A composite null has multiple configurations. For example, both of these configurations fall into the conjunction null hypothesis: "true gene-brain association, no case-control association"; "no gene-brain association; true case-control association". A valid conjunction test has to control false positive risk over all possible configurations in the conjunction null. Put another way, a conjunction test has to be calibrated for the worst possible configuration of true signals, and as a result can be quite conservative when the true state of the model is not one of the extreme cases.

The method of Deng *et al.*³⁶ attempts to reduce the conservativeness of the conjunction procedure in the multiple testing setting. The authors propose a method that estimates prevalence of null hypotheses in each of the individual tests being combined. With this information, a 'relaxed' test can be constructed that is less conservative. However, a crucial equation in that paper is in error. The equation below provides the estimator for the proportion of false null hypothesis for each of the two tests to be combined. The expression is based on the method of Storey³⁷,

who posed it as an estimate of the proportion of true null hypotheses. Deng $et\ al.^{36}$ apparently inverted the result incorrectly; the correct expression is

$$\hat{\pi}_{i}(\lambda) = 1 - \frac{\#\{p_{i}(j) > \lambda\}}{(1 - \lambda)n}$$

In our analyses, the parameter λ in the equation above was set to 0.25.

SNP meta-analysis. We combined the association P-values of SNPs associated with schizophrenia with SNPs associated with the seven subcortical brain volumes and ICV from ENIGMA. Using METAL 35 , we conducted a sample size-weighted meta-analysis for schizophrenia (effective sample size 71,715) and ENIGMA (variable sample sizes per SNP ranging from 8,000 to 11,000). SNPs were excluded if they were not present in both data sets and for MAF < 1% (per analysis). The total number of SNPs present in the eight meta-analyses ranged from 7,847,762 to 7,945,194.

SNP effect size comparisons. SNP effect sizes were extracted from studies of brain structure (ENIGMA)9, schizophrenia (PGC)3, height (GIANT)24 and educational attainment (EduYears)38. The five highest effect size SNPs were selected for schizophrenia and height; all genome-wide significant SNPs were displayed for brain structure volumes and EduYears. Percent variance was calculated on the liability scale for schizophrenia for comparison with quantitative traits23. For brain structures, height and EduYears, percent variance explained was calculated as $R^2_{gg}/(1-R^2_c) = (t^2/[(n-k-1)+t^2)] \times 100$, where the *t*-statistic is calculated as the β-coefficient for a given SNP from the regression model (controlling for covariates) divided by the standard error of the β-estimate, *n* is the total number of subjects and *k* is the total number of covariates. 95% confidence intervals were calculated by transforming percent variance explained to a *z*-statistic using Fisher's Z transformation, finding the 95% confidence intervals of the *z*-statistic, and transforming this interval back into percent variance explained.

A Supplementary Methods Checklist is available.

- 34. Fuchsberger, C., Abecasis, G.R. & Hinds, D.A. minimac2: faster genotype imputation. *Bioinformatics* **31**, 782–784 (2015).
- Willer, C.J., Li, Y. & Abecasis, G.R. METAL: fast and efficient meta-analysis of genome-wide association scans. *Bioinformatics* 26, 2190–2191 (2010).
- Deng, X., Xu, J. & Wang, C. Improving the power for detecting overlapping genes from multiple DNA microarray-derived gene lists. *BMC Bioinformatics* 9 (suppl. 6), S14 (2008).
- 37. Storey, J.D. A direct approach to false discovery rates. J. R. Stat. Soc. Series B Stat. Methodol. 63, 479-498 (2002).
- Rietveld, C.A. et al. & LifeLines Cohort Study. GWAS of 126,559 individuals identifies genetic variants associated with educational attainment. Science 340, 1467–1471 (2013).

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