#### JAMA Psychiatry | Original Investigation

# The Genetic Architecture of Depression in Individuals of East Asian Ancestry A Genome-Wide Association Study

Olga Giannakopoulou, PhD; Kuang Lin, PhD; Xiangrui Meng, PhD; Mei-Hsin Su, PhD; Po-Hsiu Kuo, PhD; Roseann E. Peterson, MD; Swapnil Awasthi, MSc; Arden Moscati, MSc; Jonathan R. I. Coleman, PhD; Nick Bass, MD; Iona Y. Millwood, DPhil; Yiping Chen, DPhil; Zhengming Chen, DPhil; Hsi-Chung Chen, MD, PhD; Mong-Liang Lu, MD, MS; Ming-Chyi Huang, MD, PhD; Chun-Hsin Chen, MD, PhD; Eli A. Stahl, PhD; Ruth J. F. Loos, PhD; Niamh Mullins, PhD; Robert J. Ursano, MD; Ronald C. Kessler, MD; Murray B. Stein, MD, MPH; Srijan Sen, MD, PhD; Laura J. Scott, PhD; Margit Burmeister, PhD; Yu Fang, MSE; Jess Tyrrell, PhD; Yunxuan Jiang, PhD; Chao Tian, PhD; Andrew M. McIntosh, PhD; Stephan Ripke, MD; Erin C. Dunn, ScD, MPH; Kenneth S. Kendler, MD; Robin G. Walters, PhD; Cathryn M. Lewis, PhD; Karoline Kuchenbaecker, PhD; for the 23andMe Research Team, China Kadoorie Biobank Collaborative Group, and Major Depressive Disorder Working Group of the Psychiatric Genomics Consortium

**IMPORTANCE** Most previous genome-wide association studies (GWAS) of depression have used data from individuals of European descent. This limits the understanding of the underlying biology of depression and raises questions about the transferability of findings between populations.

**OBJECTIVE** To investigate the genetics of depression among individuals of East Asian and European descent living in different geographic locations, and with different outcome definitions for depression.

**DESIGN, SETTING, AND PARTICIPANTS** Genome-wide association analyses followed by meta-analysis, which included data from 9 cohort and case-control data sets comprising individuals with depression and control individuals of East Asian descent. This study was conducted between January 2019 and May 2021.

**EXPOSURES** Associations of genetic variants with depression risk were assessed using generalized linear mixed models and logistic regression. The results were combined across studies using fixed-effects meta-analyses. These were subsequently also meta-analyzed with the largest published GWAS for depression among individuals of European descent. Additional meta-analyses were carried out separately by outcome definition (clinical depression vs symptom-based depression) and region (East Asian countries vs Western countries) for East Asian ancestry cohorts.

MAIN OUTCOMES AND MEASURES Depression status was defined based on health records and self-report questionnaires.

**RESULTS** There were a total of 194 548 study participants (approximate mean age, 51.3 years; 62.8% women). Participants included 15 771 individuals with depression and 178 777 control individuals of East Asian descent. Five novel associations were identified, including 1 in the meta-analysis for broad depression among those of East Asian descent: rs4656484 ( $\beta = -0.018$ , SE = 0.003,  $P = 4.43 \times 10^{-8}$ ) at 1q24.1. Another locus at 7p21.2 was associated in a meta-analysis restricted to geographically East Asian studies ( $\beta = 0.028$ , SE = 0.005,  $P = 6.48 \times 10^{-9}$  for rs10240457). The lead variants of these 2 novel loci were not associated with depression risk in European ancestry cohorts ( $\beta = -0.003$ , SE = 0.005, P = .53 for rs4656484 and  $\beta = -0.005$ , SE = 0.004, P = .28 for rs10240457). Only 11% of depression loci previously identified in individuals of European descent reached nominal significance levels in the individuals of East Asian descent. The transancestry genetic correlation between cohorts of East Asian and European descent for clinical depression was r = 0.413 (SE = 0.159). Clinical depression risk was negatively genetically correlated with body mass index in individuals of East Asian descent (r = -0.212, SE = 0.0084), contrary to findings for individuals of European descent.

**CONCLUSIONS AND RELEVANCE** These results support caution against generalizing findings about depression risk factors across populations and highlight the need to increase the ancestral and geographic diversity of samples with consistent phenotyping.

JAMA Psychiatry. 2021;78(11):1258-1269. doi:10.1001/jamapsychiatry.2021.2099 Published online September 29, 2021. Supplemental content

Author Affiliations: Author

affiliations are listed at the end of this article.

Group Information: A complete list of the members of the 23andMe Research Team, China Kadoorie Biobank Collaborative Group, and Major Depressive Disorder Working Group of the Psychiatric Genomics Consortium appears in Supplement 8.

Corresponding Author: Karoline Kuchenbaecker, PhD, Division of Psychiatry, University College London, Tottenham Court Road, London W1T 7NF, United Kingdom (k.kuchenbaecker@ucl.ac.uk).

jamapsychiatry.com

epression affects an estimated 300 million people<sup>1</sup> and represents a leading cause of health-related disabilities. More than 80% of the global burden affects lowand middle-income countries.<sup>2,3</sup> To date, 102 genetic variants have been associated with depression liability.<sup>4-7</sup> However, most previous genetic studies have been conducted in European ancestry cohorts.<sup>8</sup> Extending this work to other population groups can yield new biological insights pertinent to specific populations and facilitate improved genetic risk prediction across ancestry groups.<sup>9,10</sup>

The manifestation of depression varies. In China, the disorder traditionally associated with serious stress is neurasthenia, characterized by strong physical and psychological fatigue.<sup>11</sup> Depression-like presentations are becoming more common in recent times.<sup>12</sup> However, somatic symptoms tend to be emphasized over emotional and cognitive symptoms.<sup>13</sup> Previous studies of US individuals of European descent have reported the absence of high-arousal positive emotions, such as excitement or enthusiasm, as a main feature of depression, while presentations in Chinese individuals emphasize the absence of low-arousal positive states, such as peacefulness.<sup>14-16</sup> Consequently, different items on depression scales tend to be useful markers of depression across populations and ethnic groups,17-19 raising questions about what depression means and how best to assess it cross-culturally for research.

In this study, we have combined data from the China, Oxford, and Virginia Commonwealth University Experimental Research on Genetic Epidemiology (CONVERGE) consortium,<sup>20</sup> China Kadoorie Biobank (CKB), and the Taiwan-Major Depressive Disorder (MDD) study, as well as studies conducted in the US and UK that included participants of East Asian ancestry, to carry out the first (to our knowledge) large GWAS meta-analysis of depression among 194 548 individuals with East Asian ancestry. We aimed to identify novel depression loci, assess the transferability of genetic risk factors between individuals of European and East Asian descent, characterize the genetic architecture associated with different depression definitions, and compare the findings between ancestry cohorts.

#### Methods

#### **Participating Studies and Depression Definitions**

This genome-wide association study was conducted between January 2019 and May 2021. We included data from CKB, CONVERGE, and the Taiwan-MDD study, as well as US- and UK-based cohorts with DNA samples of individuals of East Asian descent: 23andMe Inc, Women's Health Initiative (WHI), Mount Sinai Bio*Me* Biobank, Intern Health Study (IHS), the Study to Assess Risk and Resilience in Servicemembers (Army-STARRS), and UK Biobank (UKB). The data for WHI presented in the current publication are based on the use of study data downloaded from the dbGaP website, under phs000200.v12.p3. Details about these cohorts and data sets are available in eTable 1 in Supplement 1 and eAppendix 1 in Supplement 2. All participants provided written

jamapsychiatry.com

#### **Key Points**

**Question** Are the genetic risk factors for depression the same in individuals of East Asian and European descent?

**Findings** In this genome-wide association meta-analysis of depression in 194 548 individuals with East Asian ancestry, 2 novel genetic associations were identified, one of which is specific to individuals of East Asian descent living in East Asian countries. There was limited evidence for transferability with only 11% of depression loci previously identified in individuals of European descent reaching nominal significance levels in the individuals of East Asian descent.

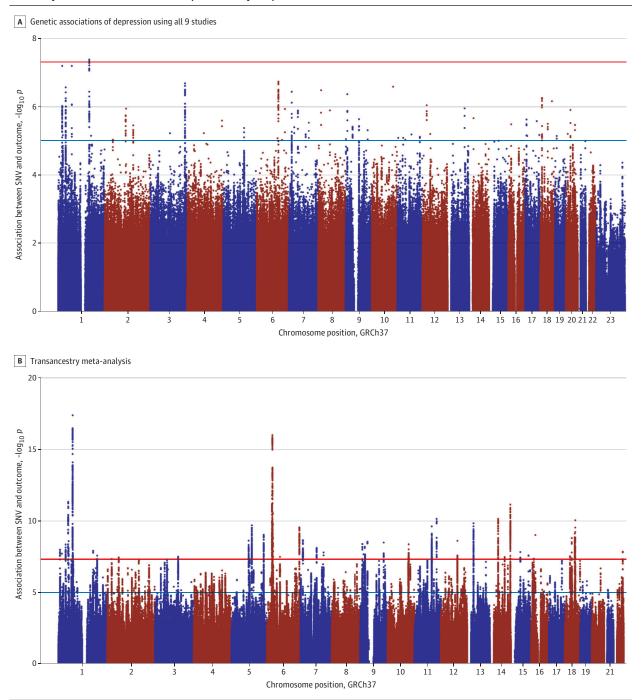
Meaning Caution is advised against generalizing findings about genetic risk factors for depression beyond the studied population.

informed consent, and each study obtained approval from local ethical review boards. Genotyping data were exported from China to the Oxford CKB International Coordinating Centre under Data Export Approvals 2014-13 and 2015-39 from the Office of Chinese Human Genetic Resource Administration. The CKB analyses were conducted under project 2018-0018 as approved by the CKB Research Committee. Details of each cohort have been previously described.<sup>20-30</sup> This study followed the Strengthening the Reporting of Genetic Association Studies (STREGA) reporting guideline.

This investigation was based on data from individuals with East Asian ancestry as defined by the investigators based on genetic information. For each study, a principal component analysis was carried out based on the genetic similarity of pairs of individuals. Individuals that clustered around a reference group with confirmed East Asian ancestry were included in this analysis.

We used a range of measures to define depression, including structured clinical interviews, medical health care records, symptom questionnaires, and self-completed surveys in a broad discovery association analysis of 15 771 depression cases and 178 777 controls (eTable 1 in Supplement 1). We also split the sample to perform outcome-specific analyses based on clinical depression or symptom-based depression. For the analysis based on clinical depression, participants reporting lifetime symptoms that were likely to fulfill DSM criteria for MDD and individuals diagnosed with a depressive disorder based on medical records from primary and secondary health care were classified as having depression. In this analysis (8223 patients with depression and 85 370 control participants), we combined data from CONVERGE, Taiwan-MDD study, UKB, Army-STARRS, BioMe, and CKB. The symptom-based depression analysis used short questionnaires to identify those with self-reported depression symptoms in general population cohorts, including the CKB (CIDI-trigger symptoms), WHI, and IHS (6124 individuals with depression, 73 095 control participants). We conducted additional association analyses in which cohorts were regrouped by region: cohorts in East Asian countries (12 027 individuals with depression and 83 727 control participants) vs cohorts with participants of East Asian descent in the US and UK studies (3744 individuals with depression, 95 050 control participants) (eTable 1 in Supplement 1).

Figure 1. Manhattan Plot of the Genetic Associations With Depression in Ancestrally East Asian Samples Using All 9 Studies and the Transancestry Meta-analysis Between East Asian and European Ancestry Samples



The y-axes show the  $-\log_{10}P$  values of the association between each single-nucleotide variant and the outcome. The x-axes show the chromosomal position (GRCh37). The red line represents the genome-wide significance threshold of 5 x  $10^{-8}$  and the blue line,  $10^{-5}$ .

#### **Genetic Association Analyses and Meta-analyses**

Genotyping and quality control are described in eAppendix 1 and eTable 2 in Supplement 2. Single-nucleotide variant (SNV)-level associations with depression were assessed using logistic regression in the 23andMe, Taiwan-MDD study, Army-STARRS, UKB, WHI, and IHS cohorts. Linearmixed models were used in the association analysis for CONVERGE (FastLMM, version 2.06.20130802)<sup>31</sup> as well as CKB and Bio*Me* (SAIGE, version 0.36.1)<sup>32</sup> to adjust for population structure and relatedness. We assessed an additive per-allele model. Unstandardized  $\beta$  estimates and standard errors (SEs) were calculated. Age, sex, principal components, and study-specific covariates (eg, study arm in WHI) were included as covariates.

rs-id <sup>a</sup>	CHR:position	EA/OA	Cohort	No. of individuals with depression; No. of control participants	EAF	β (SE)	OR (95% CI) <sup>b</sup>	P value
Discovery set: East Asian ancestry GWAS of broad depression								
rs4656484	4656484 1:166145466 C/G	EASc	15 771; 178 777	0.63	-0.018 (0.003)	0.94 (0.91-0.97)	4.43×10 <sup>-8</sup>	
			EUR <sup>d</sup>	170 756; 329 443	0.76	-0.003 (0.005)	1.00 (0.99-1.01)	.53
Discovery set: s	tudies conducted in E	ast Asian coun	tries					
rs10240457	7:15431149	A/G	East Asia <sup>e</sup>	12 027; 83 727	0.65	0.028 (0.005)	1.08 (1.05-1.12)	6.48×10 <sup>-9</sup>
			EUR <sup>d</sup>	170 756; 329 443	0.50	-0.005 (0.004)	1.00 (0.99-1.00)	.28
Discovery set: n	neta-analysis combini	ng ancestrally	East Asian and E	uropean samples				
rs7548487	1:177025098	A/G	EAS+EUR <sup>f</sup>	186 527; 508 220	0.90	-0.013 (0.002)	0.96 (0.95-0.98)	1.29×10 <sup>-8</sup>
			EAS <sup>c</sup>	15 771; 178 777	0.95	-0.016 (0.007)	0.95 (0.89-1.01)	.02
			EUR <sup>d</sup>	170 756; 329 443	0.88	-0.035 (0.007)	0.97 (0.96-0.97)	1.26×10 <sup>-7</sup>
rs547488	18:26481463	C/G	EAS+EUR <sup>f</sup>	186 527; 508 220	0.54	0.008 (0.001)	1.02 (1.01-1.03)	3.25×10 <sup>-8</sup>
			EASc	15 771; 178 777	0.78	0.011 (0.004)	1.05 (1.01-1.08)	.003
			EUR <sup>d</sup>	170 756; 329 443	0.45	0.020 (0.004)	1.02 (1.01-1.03)	3.12×10 <sup>-6</sup>
rs12160976	22:46438246	A/G	EAS+EUR <sup>f</sup>	186 527; 508 220	0.25	-0.009 (0.002)	0.98 (0.97-0.98)	1.55×10 <sup>-8</sup>
			EASc	15 771; 178 777	0.02	-0.026 (0.011)	0.91 (0.81-1.03)	.02
			EUR <sup>d</sup>	170 756; 329 443	0.34	-0.024 (0.005)	0.98 (0.97-0.99)	2.40×10 <sup>-7</sup>

Abbreviations: CHR, chromosome; EA, effect allele; EAF, effect allele frequency; EAS, East Asian descent; EUR, European descent; OA, other allele; OR. odds ratio.

coefficients for EAS and EAS+EUR.

<sup>c</sup> East Asian ancestry GWAS of broad depression outcome.

<sup>a</sup> Only the lead variant of each locus is included. The association results for these variants in European ancestry samples from the largest published meta-analysis for depression are also shown.<sup>7</sup>

<sup>b</sup> Based on an inverse-variance-weighted meta-analysis of the regression

We performed a *z*-score weighted meta-analysis using METAL, version 2011-03-25<sup>33</sup> for 13163200 genetic variants (eFigure 1 in Supplement 2). For all meta-analyses, results were restricted to variants present in at least 2 studies. We also performed a *z*-score weighted meta-analysis combining results from our analysis of individuals of East Asian descent and the publicly available summary statistics from the largest published GWAS of participants of European descent.<sup>7</sup>

#### Reproducibility of Established Depression Loci

We assessed whether the associations of 102 established depression loci from the largest published European ancestry GWAS<sup>7</sup> were reproducible in samples from individuals with East Asian ancestry. We compared this to the absolute number of associations out of the 102 that we are powered to observe if the effect size estimates in individuals of East Asian ancestry are consistent with the effect size estimates from the European ancestry studies. For benchmarking, we also assessed the reproducibility of these established loci in ancestrymatched cohorts. We used independent European ancestry GWAS for depression with different sample sizes (BioMe, BioVU, FinnGen, 23andMe).

#### **Heritability and Genetic Correlations**

We estimated the SNV heritability  $(h^2)$  using linkage disequilibrium score regression33 and bivariate genome-based restricted maximum likelihood (GREML) implemented in the GCTA software version 1.92<sup>34</sup> for the 2 large Chinese data sets, CONVERGE and CKB (symptom-based definition). For this

jamapsychiatry.com

<sup>d</sup> Published results from depression GWAS with European ancestry samples.

<sup>e</sup> Depression GWAS restricted to studies conducted in East Asian countries.

<sup>f</sup> Meta-analysis between East Asian GWAS<sup>c</sup> and European ancestry GWAS.<sup>d</sup>

analysis we applied several prevalence estimates, ranging from 6.5%<sup>35</sup> to 15%.<sup>6</sup>

We estimated transancestry genetic correlations between depression in cohorts of East Asian descent and European descent using POPCORN, version 1.0.36 We only present genetic correlation estimates where the standard error was less than 0.3. For clinical depression in individuals of European descent, we used the summary statistics from 45 396 individuals with a DSM-based diagnosis of major depressive disorder and 97 250 control participants included in the latest GWAS,<sup>7</sup> excluding UKB and 23andMe. Additionally, we generated a symptom-based definition for individuals of European descent using the Patient Health Questionnaire 9 and a cutoff score of 10.25,37,38

#### Results

#### Genome-Wide Association Meta-analysis of Depression in Individuals of East Asian Descent

Participants included 15771 individuals with depression and 178 777 control participants from 9 different studies<sup>20-30,39,40</sup> (eTable 1 in Supplement 1). The meta-analysis yielded results for 9223944 variants with 1 region associated at genomewide significance (Figure 1A; eTable 3 in Supplement 3). Variant rs4656484 at a previously unreported locus, 1q24.1, was associated with depression ( $\beta$  for C allele = -0.018, SE = 0.003, effect allele frequency [EAF] = 0.635,  $P = 4.4 \times 10^{-8}$ ) (Table). It had consistent effect sizes across all studies except UKB (133 individuals with depression and 366 control participants) (eFigure 2 in Supplement 2). In the UK Brain Expression Consortium resource (UKBEC),<sup>41</sup> rs4656484 was associated with expression of *LMX1A* (OMIM 600298), which has been linked to dopamine neuron development.<sup>42</sup> The tissue group showing the strongest eQTL association was frontal cortex ( $P = 1.1 \times 10^{-4}$ ).<sup>42</sup>

# Association Analyses by Geographic Region and Depression Definition

We further investigated associations by geographic region and by depression definition. We carried out separate metaanalyses in the studies conducted in East Asian countries (12 027 individuals with depression and 83 727 control participants)<sup>20-22</sup> and in studies with ancestrally East Asian participants conducted in the US and the UK (3744 individuals with depression and 95 050 control participants)<sup>23-30,39,40</sup> (eTable 4 in Supplement 4). A novel locus at 7p21.2 was associated with depression at genome-wide significance in the analysis of the studies conducted in East Asia (Table). The lead SNV, rs10240457 (EAF = 0.646,  $\beta$  for A allele = 0.028, SE = 0.005,  $P = 5.0 \times 10^{-9}$ ) is intronic to AGMO (OMIM 613738). This gene cleaves the O-alkyl bond of ether lipids, which are essential components of brain membranes and function in cellsignaling and other critical biological processes. This variant did not display evidence of association in the samples from studies conducted in the US and UK ( $\beta$  = 0.001, SE = 0.005, P = .79) (eFigure 3 in Supplement 2). No other associations were observed at genome-wide significance (eTable 4 in Supplement 4).

We also split the sample to perform outcome-specific analyses (ie, those with clinical diagnosis of depression vs those with self-reported symptoms of depression). No variants were associated at genome-wide significance in the meta-analysis for clinical diagnosis (8223 individuals with depression and 85 370 control participants) nor for symptom-based depression (6124 individuals with depression and 73 095 control participants) (eTable 1 in Supplement 1 and eTable 5 in Supplement 5).

#### Meta-analysis of Studies of Participants of East Asian Descent and Studies of Participants of European Descent

We carried out a meta-analysis for the broad depression outcome in cohorts of East Asian descent and the largest GWAS of depression in cohorts of European descent<sup>7</sup> (Figure 1B; eFigure 4 in Supplement 2). Variants at 43 loci were associated at genome-wide significance. Out of these, 3 loci had not been previously reported, nor did they reach genome-wide significance in either the analysis of European descent cohorts or East Asian descent cohorts alone (Table; eTable 6 in Supplement 6). There was no significant heterogeneity for any of the lead variants at the newly identified loci. The lead variant at 1q25.2, rs7548487 ( $\beta$  for A allele = -0.013, SE = 0.002,  $P = 1.29 \times 10^{-8}$ ), is located in an intron of ASTN1 (OMIM 600904). Astrotactin is a neuronal adhesion molecule required for glial-guided migration of young postmitotic neuroblasts in cortical regions of the developing brain.<sup>43</sup> The C allele of the lead variant at 18q12.1, rs547488, had a  $\beta$  of 0.008 (SE = 0.001) and  $P = 3.3 \times 10^{-8}$ . This variant is located downstream of *CDH2* (OMIM 114020), which encodes N-cadherin and has been shown to play a role in the development of the nervous system and be associated with neurodevelopmental disorders.<sup>44</sup> The third locus is 22q13.31 with lead variant rs12160976 ( $\beta$  for A allele = -0.009, SE = 0.002, *P* = 1.6 × 10<sup>-8</sup>).

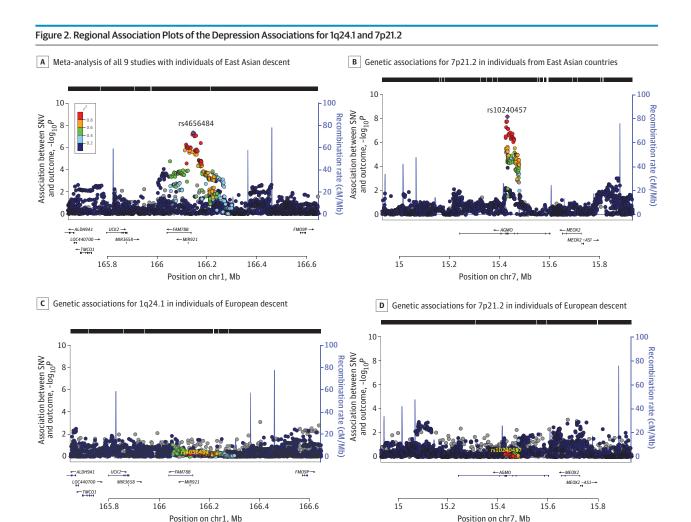
#### **Reproducibility of Depression-Associated Loci**

Although the lead variants of both novel associations from the meta-analyses of individuals of East Asian descent were common in individuals of European descent (EAF = 0.76 and EAF = 0.65 in 1000 Genomes Project phase 3 of individuals of European descent for rs4656484 and rs10240457, respectively), they were not associated with depression in the largest published meta-analysis of depression among individuals of European descent,<sup>7</sup> and effect sizes similar to those in cohorts of East Asian descent can be ruled out (Table). None of the variants in the credible sets displayed evidence of association at nominal significance levels in the meta-analysis of European ancestry cohorts (**Figure 2**).

We assessed evidence for reproducibility of previously reported loci for depression. The 2 genome-wide significant loci previously identified in the CONVERGE study<sup>20</sup> did not show evidence of association in any of the other data sets of cohorts with East Asian ancestry included in this study (eFigure 5 and eTable 7 in Supplement 2). It is worth noting that the effect sizes of these loci in the largest published metaanalysis of depression among individuals of European descent<sup>7</sup> (eTable 7 in Supplement 2) were also close to 0 for both variants, and the 95% CIs did not overlap with those from CONVERGE (eg, rs12415800 in CONVERGE:  $\beta = 0.152$ ; 95% CI = 0.097 to 0.207; European ancestry GWAS:  $\beta = -0.004$ ; 95% CI = -0.041 to 0.033).<sup>20</sup>

Of the 102 genetic variants that were independently associated with depression risk in individuals with European ancestry,<sup>7</sup> 94 lead variants were present in the data for individuals of East Asian ancestry (eTable 8 in Supplement 7). Of these variants, 63 variants (67%) had consistent direction of effect sizes in the European and East Asian ancestry GWASs, more than expected by chance (P = .001). Only 11% of these variants were associated with depression at nominal significance in the meta-analysis of cohorts of East Asian descent, although our study was powered to observe 43% under the assumption that the effect sizes are consistent between the cohorts of East Asian descent and the cohorts of European descent (eFigure 6 in Supplement 2). There was no evidence for enrichment of associations at more stringent P value thresholds.

For comparison, we also tested how many of the 102 established loci were reproducible in ancestry-matched studies, using several independent European ancestry GWASs with different depression definitions. The expected reproducibility rates varied widely, reflecting the differences in power. The largest data set from 23andMe had a reproducibility rate of 84%, which compared to an expected value of 99% (ratio = 0.86) (eTable 9 in Supplement 2). The lowest reproducibility relative to the expected value was observed for FinnGen, with a ratio of 0.40. However, this was still considerably higher than the ratio of observed vs expected reproducibility for the metaanalysis of cohorts of East Asian ancestry (ratio = 0.25).



The y-axes show the  $-\log_{10}P$  values of the association between each SNV and the outcome. The x-axes show the chromosomal position (GRCh37). A Genetic associations for 1q24.1 in the meta-analysis of all 9 studies with ancestrally East Asian samples. B, Genetic associations for 7p21.2 in studies conducted in East Asian countries. C, Genetic associations for 1q24.1 in the largest European

depression GWAS.<sup>8</sup> D, Genetic associations for 7p21.2 based on the largest European depression GWAS.<sup>8</sup> The purple diamond shows the lead SNV in each region; the color coding depicts the linkage disequilibrium with the lead SNV based on the 1000 Genomes East Asian reference panel.

#### Heritability and Genetic Correlations

The SNV heritability in CONVERGE was 26.2% (SE = 0.03) on the liability scale and 6.4% (SE = 0.02) for CKB based on a prevalence of 6.5%. The clinical diagnosis and symptombased depression meta-analyses in individuals of East Asian descent had  $h^2$  estimates of 6.8% (SE = 0.02) and 3.8% (SE = 0.04), respectively (eTable 10 in Supplement 2). However, it is likely that depressive symptoms were more common in the population than clinical depression. When we assumed a prevalence estimate of 15%, as in analyses of individuals of European descent, all heritability estimates were significantly increased.

The transancestry genetic correlation between cohorts of East Asian and European descents for clinical depression was r = 0.413 (SE = 0.159). We also compared the clinical definition in cohorts of East Asian descent with the symptombased definition for cohorts of European descent, and the genetic correlation was lower: r = 0.223 (SE = 0.181). When using

the symptom-based definition for the cohorts of both East Asian and of European descents, we found a correlation of r = 0.433 (SE = 0.281). The highest estimate was observed for the comparison of symptom-based depression in individuals of East Asian descent with clinical depression in individuals of European descent: r = 0.558 (SE = 0.221). For benchmarking, we also summarized genetic correlations between independent cohorts of East Asian and European descents for other traits and diseases, such as cholesterol, breast cancer, and age at menarche (eTable 11 in Supplement 2). The estimates from large GWASs were consistently higher than the estimates for depression. The genetic correlations for studies with at least 2000 cases ranged from 0.7 to 1. The genetic correlation from the largest study of schizophrenia was r = 0.98 (SE = 0.03),<sup>45</sup> and for bipolar disorder, the correlation was r = 0.718 (SE not reported).46

We also assessed the sharing of genetic risk factors between depression in individuals of East Asian descent with

jamapsychiatry.com

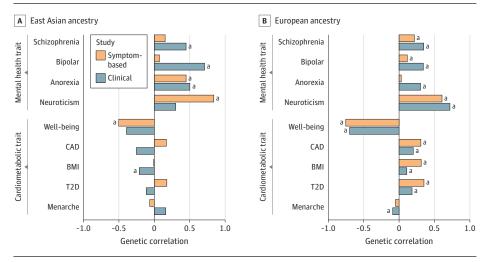


Figure 3. Genetic Correlations for Clinical and Symptom-Based Depression With Cardiometabolic and Mental Health Traits

> Correlations are shown for samples with East Asian ancestry (A) and European ancestry (B) for the depression studies. For the cardiometabolic and mental health traits, publicly available summary statistics from studies with European ancestry samples were used. Blue bars represent the clinical outcome definition, and orange bars the symptom-based outcome. BMI indicates body mass index; CAD, coronary artery disease; T2D, type 2 diabetes.

<sup>a</sup> Genetic correlations statistically different from zero.

other diseases and traits from published summary statistics of studies of individuals of European descent (eTables 12 and 13 in Supplement 2). For clinical depression in individuals of East Asian descent, the highest genetic correlation was observed for bipolar disorder (r = 0.710 [SE = 0.153]) (Figure 3).<sup>47</sup> Clinical depression also had significant positive genetic correlations with other psychiatric disorders, including anorexia nervosa (r = 0.502 [SE = 0.158]) and schizophrenia (r = 0.449 [SE = 0.109]).<sup>48,49</sup> For symptom-based depression, the highest correlation was observed for the personality trait of neuroticism (r = 0.840 [SE = 0.216]). Symptom-based depression was also negatively correlated with subjective wellbeing (r = -0.502 [SE = 0.195]).<sup>50</sup>

Depression in individuals of European descent has been reported to be genetically correlated with unfavorable cardiometabolic profiles.<sup>6</sup> However, we observed the opposite for body mass index (BMI) in this study. For clinical depression in individuals of East Asian descent, there was a statistically significant negative genetic correlation with BMI from a GWAS of individuals of European descent (r = -0.212 [SE = 0.084]).<sup>51</sup> The transancestry correlations with type 2 diabetes (T2D) and coronary artery disease were also negative, but not significantly different from 0: r = -0.113 (SE = 0.113) and r = -0.253 (SE = 0.160, respectively).<sup>52,53</sup>

For a subset of these traits, results for large GWASs of cohorts of East Asian descent were also available. We used these to validate the genetic correlations for depression in individuals of East Asian descent (eFigure 7 and eTable 14 in Supplement 2). For clinically diagnosed depression in individuals of East Asian descent, the estimates were highly consistent for correlations with schizophrenia (r = 0.447 [SE = 0.085]), BMI (r = -0.147 [SE = 0.061]), and T2D (r = -0.143 [SE = 0.072]).<sup>45,54,55</sup> Correlations between symptom-based depression and the aforementioned traits in individuals of East Asian descent were in the same direction but weaker: schizophrenia (r = 0.189 [SE = 0.137]); BMI (r = -0.082 [SE = 0.098]); and T2D (r = -0.088 [SE = 0.120]).

#### Discussion

Herein, we present results of the largest (to our knowledge) GWAS for depression in samples with East Asian ancestry (15771 individuals with depression and 178777 control participants). Our results demonstrate the value of combining data from studies with different outcome definitions and study designs, as the increased sample size can empower the discovery of novel associations. Variant rs4656484 at 1q24.1 was associated in studies of individuals of East Asian descent that used different definitions for depression, which suggests that this locus may be linked to the part of the genetic predisposition that is shared between different depression outcomes. Furthermore, by combining GWASs of cohorts of East Asian and European descents, we identified 3 additional novel associations that were not significant in analyses of either the East Asian ancestry cohorts or the European ancestry cohorts alone.

We also observed differences by ancestry, depression outcome definition, and geographic region that highlight the heterogeneity underlying depression. Several depression loci were not transferable between studies of cohorts of East Asian and European ancestry. The newly identified variant rs4656484 was not associated with depression in a previous GWAS of individuals of European descent<sup>7</sup> ( $\beta = 0.003$ ; SE = 0.005; P = .53), and an effect size similar to that observed in individuals of East Asian descent can be ruled out. Conversely, only 11% of the established depression loci from studies of participants of European descent were associated with depression at nominal significance in the meta-analysis of individuals of East Asian descent, although the study was powered to observe 43%. The ratio of observed to expected reproducibility was 0.25 for our meta-analysis of individuals of East Asian descent, which was lower than the ratios for several independent ancestrymatched depression GWASs (ratios ranged from 0.40 to 0.86). In line with this, we found moderate transancestry genetic correlations between the depression outcomes in studies of cohorts of East Asian and European descents, ranging from 0.223 to 0.558, consistent with previous findings.<sup>56</sup> These results are considerably lower than transancestry correlation estimates for other psychiatric traits, such as schizophrenia (r = 0.98).<sup>45</sup> Low transferability could limit downstream applications of depression genetics in transancestry settings, for example in genetic risk prediction.

We also identified a novel depression association at 7p21.2 in studies conducted in East Asian countries. The lead variant was not associated with depression in the US and UK-based data sets, suggesting that nongenetic factors may play an important role for the transferability of loci.<sup>57</sup> In the context of the growing number of transancestry GWAS meta-analyses, this highlights the importance of considering geographic region as well as genetic ancestry.

Although the genetic risk factors overlap between different depression definitions, their genetic architecture differs, as demonstrated by previous research based on studies of individuals of European descent.<sup>58</sup> We estimated SNV heritability to be 0.26 in CONVERGE (for severe recurrent depression)<sup>59</sup> and 0.06 in CKB (for symptom-based depression), which is similar to the previously reported range for different studies of cohorts of European descent of 0.09 to 0.26.<sup>6</sup> The estimate for CKB supports the hypothesis that lower heritability estimates are linked to less stringent outcome definitions.<sup>58</sup> However, 0.06 is likely to be an underestimation because the underlying prevalence rate should be higher. In the absence of widely accepted prevalence rates for each of these outcomes in China due to the wide variation in estimates,<sup>60</sup> we applied the same prevalence estimate for symptom-based and clinical diagnosis definitions of depression.

To account for the differences between clinical and symptom-based depression, we also split our sample and carried out separate association analyses. The genetic correlations with other diseases and traits identified shared and outcome-specific patterns. For clinical depression in individuals of East Asian descent, the highest genetic correlation was observed for bipolar disorder (r = 0.710), which was stronger than the respective transancestry genetic correlation with clinical depression in individuals of European descent (r = 0.413). For symptom-based depression, on the other hand, the strongest correlation was observed for the personality trait neuroticism (r = 0.840). There were also population-specific patterns. The genetic correlations of clinical depression in individuals of East Asian descent with metabolic traits were opposite to that observed for individuals of European descent. European ancestry studies have provided some evidence that BMI is a causal risk factor for major depression.<sup>6</sup> It is a matter of ongoing research to establish whether this link is due to shared metabolic mechanisms between the 2 phenotypes.<sup>61</sup> The recruitment strategy in the CONVERGE study, with a high proportion of melancholia subtype and exclusively female participants, may have contributed to the inverse correlation. However, it is unlikely to explain it fully. Symptom-based depression was also inversely correlated with BMI in CKB, but this

jamapsychiatry.com

correlation was not statistically significant. The opposite direction of effect of this risk factor across populations could suggest that the link between depression and weight is social rather than metabolic in nature. This hypothesis is supported by previous work using favorable adiposity genetic variants as an instrument to try to separate the potential biological and social effects of higher adiposity in Europeans.<sup>61</sup> Genetic variants that are associated with higher adiposity but a more favorable metabolic profile (ie, lower T2D, CAD, and dyslipidemia) were associated with higher odds of depression, suggesting it is not solely the metabolic consequences of higher BMI that drive the association.

In terms of its genetic architecture, major depressive disorder has been shown to be one of the most polygenic outcomes across a wide range of studied phenotypes in cohorts of individuals of European descent<sup>62</sup> (ie, its potential genetic effects are small and distributed across a very large number of variants in the genome). This is linked to heterogeneity of depression in terms of presentation as well as etiology that results from the complex interplay between genetic and environmental factors.63,64 Our results suggest that nongenetic factors, such as cultural differences and other factors, may further add to the heterogeneity of depression and thereby impact on its genetic architecture. First, the spectrum of depression manifestations may overlap but not be identical between cultural contexts of different ancestral groups and geographic regions. Second, many risk factors for depression are determined within a given cultural context and can themselves be heritable, which may modify genetic associations through gene-environment interactions. For example, genetic variants predisposing to higher weight would be associated with depression only in societies where obesity is stigmatized.

#### Limitations

This study has some limitations. The data sets we included used different outcome definitions, which can lead to heterogeneity in the meta-analysis. Outcome definitions based on help-seeking behavior may result in a different case group than outcome definitions that fulfill DSM criteria for major depressive disorder. More fine-grained conclusions will require greater depth of mental health phenotyping for large samples in future studies. This necessitates global studies in clinical settings as well as general population cohorts with improved mental health phenotyping to address this gap in the future. Some of the studies included in this GWAS metaanalysis used DNA microarrays that were designed for samples from individuals of European descent. These arrays may have lower coverage of the genetic variation present in populations of East Asian descent. General limitations of GWAS apply, as described by Tam et al.<sup>65</sup> There is a high multiple testing burden. Only a fraction of the heritability is explained by GWAS. Further work is needed to identify the causal variants of the novel associations. Not all genetic determinants of depression can be identified through GWAS. GWAS have largely failed to identify gene-gene interactions. Genetic associations may be influenced by population stratification. The clinical value of GWAS is limited.

studied population. It highlights the need for more diverse

samples with consistent phenotyping. Increased representation of different populations will benefit locus discovery, fine

mapping for potential causal variants, and polygenic risk score profiling and could help address health disparities.<sup>57,66-69</sup>

### Conclusions

Overall, this study implies caution against generalizing findings about genetic and other risk factors for depression beyond the

#### **ARTICLE INFORMATION**

Accepted for Publication: May 17, 2021. Published Online: September 29, 2021. doi:10.1001/jamapsychiatry.2021.2099

**Open Access:** This is an open access article distributed under the terms of the CC-BY License. © 2021 Giannakopoulou O et al. *JAMA Psychiatry*.

Author Affiliations: Division of Psychiatry, University College of London, London, United Kingdom (Giannakopoulou, Meng, Bass, Kuchenbaecker); Nuffield Department of Population Health, University of Oxford, Oxford, United Kingdom (Lin, Millwood, Y. Chen, Z. Chen, Walters); Institute of Epidemiology and Preventive Medicine, National Taiwan University College of Public Health, Taipei, Taiwan (Su, Kuo); Department of Psychiatry, National Taiwan University Hospital, Taipei, Taiwan (Kuo, H.-C. Chen); Virginia Institute for Psychiatric and Behavioral Genetics, Department of Psychiatry, Virginia Commonwealth University, Richmond, Virginia (Peterson, Kendler): Department of Psychiatry and Psychotherapy, Charité - Universitätsmedizin, Berlin, Germany (Awasthi, Ripke): The Charles Bronfman Institute for Personalized Medicine, Icahn School of Medicine at Mount Sinai, New York, New York (Moscati, Loos); Social, Genetic, and Developmental Psychiatry Centre, Institute of Psychiatry, Psychology, and Neuroscience, King's College London, London, United Kingdom (Coleman, Lewis); National Institute for Health Research Maudslev Biomedical Research Centre. King's College London, London, United Kingdom (Coleman, Lewis): MRC Population Health Research Unit, University of Oxford, Oxford, United Kingdom (Millwood, Y. Chen, Z. Chen, Walters); Department of Psychiatry, Wan-Fang Hospital, Taipei, Taiwan (Lu, C.-H. Chen); School of Medicine, College of Medicine, Taipei Medical University, Taipei, Taiwan (Lu, Huang, C.-H. Chen); Department of Psychiatry, Taipei City Psychiatric Center, Taipei, Taiwan (Huang); The Pamela Sklar Division of Psychiatric Genomics, Icahn School of Medicine at Mount Sinai, New York. New York (Stahl, Mullins); The Mindich Child Health and Development Institute, Icahn School of Medicine at Mount Sinai, New York, New York (Loos); Uniformed Services University of the Health Sciences, Bethesda, Maryland (Ursano); Harvard Medical School, Boston, Massachusetts (Kessler, Dunn); University of California, San Diego, La Jolla, California (Stein): Michigan Neuroscience Institute, Department of Psychiatry, University of Michigan, Ann Arbor, Michigan (Sen); Department of Biostatistics, University of Michigan, Ann Arbor, Michigan (Scott); Molecular & Behavioral Neuroscience Institute. Department of Computational Medicine & Bioinformatics, University of Michigan, Ann Arbor, Michigan (Burmeister); Michigan Neuroscience Institute, University of Michigan, Ann Arbor, Michigan (Fang); University of Exeter Medical School, University of Exeter, The RILD Building, RD&E Hospital, Exeter, United Kingdom (Tyrrell); 23andme, Inc, Sunnyvale, California (Jiang, Tian); Division of Psychiatry,

University of Edinburgh, Edinburgh, United Kingdom (McIntosh); Analytic and Translational Genetics Unit, Massachusetts General Hospital, Boston, Massachusetts (Ripke); Stanley Center for Psychiatric Research, Broad Institute of MIT and Harvard, Cambridge, Massachusetts (Ripke, Dunn); Psychiatric and Neurodevelopmental Genetics Unit, Center for Genomic Medicine, Massachusetts General Hospital, Boston, Massachusetts (Dunn); UCL Genetics Institute, University College of London, London, United Kingdom (Kuchenbaecker).

Author Contributions: Drs Giannakopoulou and Kuchenbaecker had full access to all of the data in the study and takes responsibility for the integrity of the data and the accuracy of the data analysis. *Concept and design:* Lewis, Kuchenbaecker. *Acquisition, analysis, or interpretation of data:* Lin, Meng, Su, Kuo, Peterson, Awasthi, Moscati, Coleman, Bass, Millwood, Y. Chen, Z. Chen, H. Chen, Lu, Huang, Stahl, Loos, Mullins, Ursano, Kessler, Stein, Sen, Scott, Fang, Tyrrell, Jiang, Tian, Ripke, Dunn, Kendler, Walters, Lewis, Kuchenbaecker.

*Drafting of the manuscript:* Giannakopoulou, Kuchenbaecker.

Critical revision of the manuscript for important intellectual content: Giannakopoulou, Lin, Meng, Su, Kuo, Peterson, Awasthi, Moscati, Coleman, Bass, Millwood, Y. Chen, Z. Chen, H. Chen, Lu, Huang, C. Chen, Stahl, Loos, Mullins, Ursano, Kessler, Stein, Sen, Scott, Burmeister, Fang, Tyrrell, Jiang, McIntosh, Ripke, Tian, Dunn, Kendler, Walters, Lewis, Kuchenbaecker.

*Statistical analysis*: Giannakopoulou, Lin, Meng, Su, Kuo, Peterson, Awasthi, Moscati, Stahl, Jiang, Tian, Walters, Lewis, Kuchenbaecker.

*Obtained funding:* Z. Chen, Loos, Kessler, Walters, Kuchenbaecker.

Administrative, technical, or material support: Giannakopoulou, Kuo, Peterson, Bass, Millwood, Z. Chen, H. Chen, Lu, C. Chen, Stahl, Mullins, Ursano, Fang, McIntosh, Dunn, Kendler, Kuchenbaecker.

Supervision: Giannakopoulou, Y. Chen, Stahl, Loos, Sen, Ripke, Walters, Lewis, Kuchenbaecker. Other—Assessment and interpretation of the association between body mass index and depression: Tyrrell.

#### Conflict of Interest Disclosures:

Dr Giannakopoulou became a full-time employee of UCB ((Union Chimique Belge) while this manuscript was being resubmitted. Dr Peterson reported receiving grants from the National Institutes of Health (NIH) (KO1MH113848) and the Brain & Behavior Research Foundation (NARSAD, 28632 P&S Fund) during the conduct of the study. Mr Moscati reported being a current employee of Regeneron Pharmaceuticals, but he was not when contributions to this work were made. Dr Stahl reported being an employee of Regeneron Pharmaceuticals outside the submitted work. Dr Kessler reported receiving personal fees from Datastat Inc and consultant and personal fees from RallyPoint Networks Inc, Sage Pharmaceuticals, and

Takeda during the conduct of the study. Dr Stein reported receiving grants from the National Institute of Mental Health (NIMH) and the Department of Defense during the conduct of the study. Dr Jiang reported being an employee of 23andMe outside the submitted work. Dr Tian reported being an employee of and receiving stock options from 23andMe during the conduct of the study. Dr McIntosh reported receiving grants from The Sackler Trust, personal fees from Illumina, and personal fees from Janssen outside the submitted work. Dr Walters reported receiving grants from Wellcome Trust (UK), Medical Research Council (UK), and Kadoorie Charitable Foundation (Hong Kong) during the conduct of the study. Dr Lewis reported receiving grants from the National Institute of Health Research (UK) during the conduct of the study. No other disclosures were reported.

Funding/Support: This study is part of a project that has received funding from Wellcome (212360/ Z/18/Z) and from the European Research Council (ERC) under the European Union's Horizon 2020 research and innovation program (Grant agreement No. 948561). Computing was supported by the **BBSRC Biotechnology and Biological Sciences** Research Council (BB/R01356X/1). Dr Lewis is supported by the MRC grant MR/N015746/1. Dr McIntosh is supported by the Wellcome Trust (104036/Z/14/Z, 216767/Z/19/Z), UKRI MRC (MC\_PC\_17209, MR/S035818/1). Dr Tyrrell is supported by an Academy of Medical Sciences (AMS) Springboard award, which is supported by the AMS, the Wellcome Trust, GCRF, the Government Department of Business. Energy and Industrial strategy, the British Heart Foundation and Diabetes UK [SBF004\1079]. Dr Dunn is supported in part by the National Institute of Mental Health of the National Institutes of Health under Award Number 1R01MH113930. This paper represents independent research part-funded by the National Institute for Health Research (NIHR) Biomedical Research Centre at South London and Maudsley NHS Foundation Trust and King's College London. China Kadoorie Biobank (CKB): Baseline survey and first re-survey: Hong Kong Kadoorie Charitable Foundation; long-term follow-up: UK Wellcome Trust (202922/Z/16/Z, 104085/Z/14/Z, 088158/Z/ 09/Z), National Natural Science Foundation of China (81390540, 81390541, 81390544), and National Key Research and Development Program of China (2016YFC 0900500, 0900501, 0900504, 1303904). DNA extraction and genotyping supported by GlaxoSmithKline and the UK Medical Research Council (MC-PC-13049, MC-PC-14135). The project was supported by British Heart Foundation, UK MRC and Cancer Research UK through core funding to the Clinical Trial Service Unit and Epidemiological Studies Unit at Oxford University. CONVERGE was funded by the Wellcome Trust (WT090532/Z/09/Z, WT083573/ Z/07/Z, WT089269/Z/09/Z) and by NIH grant MH100549. R.E.P. is supported by NIMH grant KO1MH113848 and The Brain & Behavior Research Foundation NARSAD grant 28632 P&S Fund. BioMe is supported by The Andrea and Charles Bronfman Philanthropies. R.J.F.L. is supported by funds of the NIH (ROIDK110113; ROIDK107786; ROIHL142302). Genotyping of Bio*Me* was performed in collaboration with Regeneron Genetics Center, who had no input as to the design and conduct of the study, the interpretation of the data, and preparation, review, or decision to submit the manuscript for publication. **Taiwan-MDD** was supported by projects from the National Health Research Institutes (NHRI-EX107-10627NI), the Ministry of Science and Technology (MOST 105-2628-B-002-028-MY3

108-2314-B-002-136-MY3), and the National Taiwan University Career Development Project (104R7883, 108L7860) to P-H.K. Army STARRS: This research was supported by grants awarded from the Department of the Army and funded under cooperative agreement with the US Department of Health and Human Services, National Institutes of Health, National Institute of Mental Health (NIH/NIMH) [U01MH087981]. Subsequently, STARRS-LS was sponsored and funded by the Department of Defense (USUHS grant number HU0001-15-2-0004). The contents are solely the responsibility of the authors and do not necessarily represent the views of the Department of Health and Human Services, NIMH, the Veterans Administration, Department of the Army, or the Department of Defense, IHS was funded by the National Institute of Mental Health (grant no. RO1MH101459).

Role of the Funder/Sponsor: The funders had no role in the design and conduct of the study; collection, management, analysis, and interpretation of the data; preparation, review, or approval of the manuscript; and decision to submit the manuscript for publication. Genotyping of Bio*Me* was performed in collaboration with Regeneron Genetics Center, which had no input as to the design and conduct of the study, the interpretation of the data, and preparation, review, or decision to submit the manuscript for publication.

Group Information: A complete list of the members of the 23andMe Research Team, China Kadoorie Biobank Collaborative Group, and Major Depressive Disorder Working Group of the Psychiatric Genomics Consortium appears in Supplement 8.

Disclaimer: The content is solely the responsibility of the authors and does not necessarily represent the official views of the National Institutes of Health. The views expressed are those of the authors and not necessarily those of the National Health Service, the National Institute for Health Research, or the Department of Health and Social Care. The contents are solely the responsibility of the authors and do not necessarily represent the views of the Department of Health and Human Services, NIMH, Veterans Administration, Department of the Army, or Department of Defense.

Additional Contributions: We would like to thank Na Cai, PhD, Helmholtz Pioneer Campus, Helmholtz Zentrum München; Tim Bigdeli, PhD, SUNY Downstate Health Sciences University; and Jonathan Flint, MD, University of California–Los Angeles, for their careful reading and detailed comments on the manuscript. We would like to thank Maria Valkovskaya, MA, University College London, for editing assistance. We are grateful to the thousands of participants who took part in the participating studies. All participants have given fully informed written consent. We would like to acknowledge the participants and investigators of the FinnGen study. China Kadoorie Biobank chief acknowledgment is to the participants, project staff, and China National Centre for Disease Control and Prevention (CDC) and its regional offices. China's National Health Insurance provides electronic linkage to all hospital treatment. The CONVERGE (China, Oxford, and Virginia Commonwealth University Experimental Research on Genetic Epidemiology) consortium gratefully acknowledge the support of all partners in hospitals across China, with special thanks to all the CONVERGE collaborators and patients who made this work possible. IHS: We thank the training physicians for taking part in this study. 23andMe: We would like to thank the research participants and employees of 23andMe for making this work possible. We also thank SURFsara (www.surfsara.nl) for the support in using the Lisa Compute Cluster. Written permission to include the names of the individuals in this section was obtained. There was no financial compensation provided for any additional contributions.

Additional Information: This study was conducted using the UK Biobank resource, application number 51119. Access to the data from The Women's Health Initiative study were available through dbGaP (phsOOO200.v12.p3). Data on coronary artery disease/myocardial infarction have been contributed by the CARDIoGRAMplusC4D investigators, the Myocardial Infarction Genetics and CARDIoGRAM Exome investigators and UK Biobank CardioMetabolic Consortium Coronary Heart Disease working group who used the UK Biobank Resource (application number 9922). Data have been downloaded from www. CARDIOGRAMPLUSC4D.ORG.

#### REFERENCES

1. GBD 2017 Disease and Injury Incidence and Prevalence Collaborators. Global, regional, and national incidence, prevalence, and years lived with disability for 354 diseases and injuries for 195 countries and territories, 1990-2017: a systematic analysis for the Global Burden of Disease Study 2017. *Lancet.* 2018;392(10159):1789-1858. doi:10.1016/S0140-6736(18)32279-7

2. Friedrich MJ. Depression is the leading cause of disability around the world. *JAMA*. 2017;317(15):1517. doi:10.1001/jama.2017.3826

3. World Health Organization. Depression and other common mental disorders global health estimates. Accessed October 20, 2019. https:// apps.who.int/iris/bitstream/handle/10665/254610/ WHO-MSD-MER-2017.2-eng.pdf

4. Hyde CL, Nagle MW, Tian C, et al. Identification of 15 genetic loci associated with risk of major depression in individuals of European descent. *Nat Genet*. 2016;48(9):1031-1036. doi:10.1038/ng.3623

5. Howard DM, Adams MJ, Shirali M, et al; 23andMe Research Team. Genome-wide association study of depression phenotypes in UK Biobank identifies variants in excitatory synaptic pathways. *Nat Commun.* 2018;9(1):1470. doi:10.1038/s41467-018-03819-3

**6**. Wray NR, Ripke S, Mattheisen M, et al; eQTLGen; 23andMe; Major Depressive Disorder Working Group of the Psychiatric Genomics Consortium.

Genome-wide association analyses identify 44 risk variants and refine the genetic architecture of major depression. *Nat Genet*. 2018;50(5):668-681. doi:10.1038/s41588-018-0090-3

7. Howard DM, Adams MJ, Clarke TK, et al; 23andMe Research Team; Major Depressive Disorder Working Group of the Psychiatric Genomics Consortium. Genome-wide meta-analysis of depression identifies 102 independent variants and highlights the importance of the prefrontal brain regions. *Nat Neurosci.* 2019;22(3):343-352. doi:10.1038/ s41593-018-0326-7

8. Peterson RE, Kuchenbaecker K, Walters RK, et al. Genome-wide association studies in ancestrally diverse populations: opportunities, methods, pitfalls, and recommendations. *Cell*. 2019;179(3):589-603. doi:10.1016/j.cell.2019.08.051

9. Dunn EC, Sofer T, Wang MJ, et al; Major Depressive Disorder Working Group of the Psychiatric Genomics Consortium. Genome-wide association study of depressive symptoms in the Hispanic Community Health Study/Study of Latinos. J Psychiatr Res. 2018;99:167-176. doi:10.1016/j.jpsychires.2017.12.010

**10**. Dunn EC, Wiste A, Radmanesh F, et al. Genome-wide association study (GWAS) and genome-wide by environment interaction study (GWEIS) of depressive symptoms in African American and Hispanic/Latina women. *Depress Anxiety*. 2016;33(4):265-280. doi:10.1002/da.22484

**11**. Lee S. Diagnosis postponed: shenjing shuairuo and the transformation of psychiatry in post-Mao China. *Cult Med Psychiatry*. 1999;23(3):349-380. doi:10.1023/A:1005586301895

12. Ryder AG, Sun J, Zhu X, Yao S, Chentsova-Dutton YE. Depression in China: integrating developmental psychopathology and cultural-clinical psychology. *J Clin Child Adolesc Psychol*. 2012;41(5):682-694. doi:10.1080/15374416. 2012.710163

13. Ryder AG, Chentsova-Dutton YE. Depression in cultural context: "Chinese somatization," revisited. *Psychiatr Clin North Am.* 2012;35(1):15-36. doi:10.1016/j.psc.2011.11.006

14. Tsai JL, Knutson B, Fung HH. Cultural variation in affect valuation. *J Pers Soc Psychol*. 2006;90(2): 288-307. doi:10.1037/0022-3514.90.2.288

**15.** Tsai JL, Miao FF, Seppala E, Fung HH, Yeung DY. Influence and adjustment goals: sources of cultural differences in ideal affect. *J Pers Soc Psychol*. 2007; 92(6):1102-1117. doi:10.1037/0022-3514.92.6.1102

16. Sims T, Tsai JL, Jiang D, Wang Y, Fung HH, Zhang X. Wanting to maximize the positive and minimize the negative: implications for mixed affective experience in American and Chinese contexts. J Pers Soc Psychol. 2015;109(2):292-315. doi:10.1037/a0039276

17. Iwata N, Buka S. Race/ethnicity and depressive symptoms: a cross-cultural/ethnic comparison among university students in East Asia, North and South America. *Soc Sci Med.* 2002;55(12):2243-2252. doi:10.1016/S0277-9536(02)00003-5

 Kanazawa A, White PM, Hampson SE. Ethnic variation in depressive symptoms in a community sample in Hawaii. *Cultur Divers Ethnic Minor Psychol.* 2007;13(1):35-44. doi:10.1037/1099-9809.13.1.35

**19**. Yen S, Robins CJ, Lin N. A cross-cultural comparison of depressive symptom manifestation:

China and the United States. *J Consult Clin Psychol*. 2000;68(6):993-999. doi:10.1037/0022-006X.68. 6.993

**20**. CONVERGE Consortium. Sparse whole-genome sequencing identifies two loci for major depressive disorder. *Nature*. 2015;523(7562): 588-591. doi:10.1038/nature14659

21. Chen CH, Yang JH, Chiang CWK, et al. Population structure of Han Chinese in the modern Taiwanese population based on 10,000 participants in the Taiwan Biobank project. *Hum Mol Genet*. 2016;25(24):5321-5331. doi:10.1093/ hmg/ddw346

22. Chen Z, Chen J, Collins R, et al; China Kadoorie Biobank (CKB) Collaborative Group. China Kadoorie Biobank of 0.5 million people: survey methods, baseline characteristics and long-term follow-up. *Int J Epidemiol*. 2011;40(6):1652-1666. doi:10.1093/ije/ dyr120

**23.** The Women's Health Initiative Study Group. Design of the Women's Health Initiative clinical trial and observational study. *Control Clin Trials*. 1998; 19(1):61-109. doi:10.1016/S0197-2456(97)00078-0

24. Fang Y, Scott L, Song P, Burmeister M, Sen S. Genomic prediction of depression risk and resilience under stress. *Nat Hum Behav*. 2020;4(1): 111-118. doi:10.1038/s41562-019-0759-3

**25.** Bycroft C, Freeman C, Petkova D, et al. The UK Biobank resource with deep phenotyping and genomic data. *Nature*. 2018;562(7726):203-209. doi:10.1038/s41586-018-0579-z

26. Kessler RC, Colpe LJ, Fullerton CS, et al. Design of the Army Study to Assess Risk and Resilience in Servicemembers (Army STARRS). *Int J Methods Psychiatr Res*. 2013;22(4):267-275. doi:10.1002/ mpr.1401

27. Ursano RJ, Colpe LJ, Heeringa SG, Kessler RC, Schoenbaum M, Stein MB; Army STARRS Collaborators. The Army study to assess risk and resilience in servicemembers (Army STARRS). *Psychiatry*. 2014;77(2):107-119. doi:10.1521/psyc.2014. 77.2.107

28. Stein MB, Ware EB, Mitchell C, et al; VA Mid-Atlantic Mental Illness Research, Education, and Clinical Center (MIRECC) Workgroup. Genomewide association studies of suicide attempts in US soldiers. *Am J Med Genet B Neuropsychiatr Genet*. 2017;174(8):786-797. doi:10.1002/ajmg.b.32594

**29**. Tung JY, Do CB, Hinds DA, et al. Efficient replication of over 180 genetic associations with self-reported medical data. *PLoS One*. 2011;6(8): e23473. doi:10.1371/journal.pone.0023473

**30**. Belbin GM, Odgis J, Sorokin EP, et al. Genetic identification of a common collagen disease in Puerto Ricans via identity-by-descent mapping in a health system. *Elife*. 2017;6:e25060. doi:10.7554/ eLife.25060

**31**. Lippert C, Listgarten J, Liu Y, Kadie CM, Davidson RI, Heckerman D. FaST linear mixed models for genome-wide association studies. *Nat Methods*. 2011;8(10):833-835. doi:10.1038/nmeth. 1681

**32**. Zhou W, Nielsen JB, Fritsche LG, et al. Efficiently controlling for case-control imbalance and sample relatedness in large-scale genetic association studies. *Nat Genet*. 2018;50(9):1335-1341. doi:10.1038/s41588-018-0184-y **33**. Bulik-Sullivan BK, Loh PR, Finucane HK, et al; Schizophrenia Working Group of the Psychiatric Genomics Consortium. LD Score regression distinguishes confounding from polygenicity in genome-wide association studies. *Nat Genet*. 2015; 47(3):291-295. doi:10.1038/ng.3211

**34**. Yang J, Lee SH, Goddard ME, Visscher PM. GCTA: a tool for genome-wide complex trait analysis. *Am J Hum Genet*. 2011;88(1):76-82. doi:10.1016/j.ajhg.2010.11.011

**35**. Bromet E, Andrade LH, Hwang I, et al. Cross-national epidemiology of DSM-IV major depressive episode. *BMC Med*. 2011;9:90. doi:10.1186/1741-7015-9-90

**36**. Brown BC, Ye CJ, Price AL, Zaitlen N; Asian Genetic Epidemiology Network Type 2 Diabetes Consortium. Transethnic genetic-correlation estimates from summary statistics. *Am J Hum Genet.* 2016;99(1):76-88. doi:10.1016/j.ajhg.2016.05.001

**37**. Manea L, Gilbody S, McMillan D. Optimal cut-off score for diagnosing depression with the Patient Health Questionnaire (PHQ-9): a meta-analysis. *CMAJ*. 2012;184(3):E191-E196. doi:10.1503/cmaj. 110829

**38**. Davis KAS, Coleman JRI, Adams M, et al. Mental health in UK Biobank - development, implementation and results from an online questionnaire completed by 157 366 participants: a reanalysis. *BJPsych Open*. 2020;6(2):e18. doi:10.1192/bjo.2019.100

**39**. Wassertheil-Smoller S, Shumaker S, Ockene J, et al; The Women's Health Initiative (WHI). Depression and cardiovascular sequelae in postmenopausal women. *Arch Intern Med*. 2004; 164(3):289-298. doi:10.1001/archinte.164.3.289

**40**. Eriksson N, Macpherson JM, Tung JY, et al. Web-based, participant-driven studies yield novel genetic associations for common traits. *PLoS Genet*. 2010;6:e1000993. doi:10.1371/journal.pgen. 1000993

**41**. Ramasamy A, Trabzuni D, Guelfi S, et al; UK Brain Expression Consortium; North American Brain Expression Consortium. Genetic variability in the regulation of gene expression in ten regions of the human brain. *Nat Neurosci.* 2014;17(10):1418-1428. doi:10.1038/nn.3801

**42**. Hong S, Chung S, Leung K, Hwang I, Moon J, Kim KS. Functional roles of Nurr1, Pitx3, and Lmx1a in neurogenesis and phenotype specification of dopamine neurons during in vitro differentiation of embryonic stem cells. *Stem Cells Dev*. 2014;23(5): 477-487. doi:10.1089/scd.2013.0406

**43**. Fink JM, Hirsch BA, Zheng C, Dietz G, Hatten ME, Ross ME. Astrotactin (ASTN), a gene for glial-guided neuronal migration, maps to human chromosome 1q25.2. *Genomics*. 1997;40(1):202-205. doi:10.1006/geno.1996.4538

**44**. Accogli A, Calabretta S, St-Onge J, et al; Undiagnosed Diseases Network. De novo pathogenic variants in N-cadherin cause a syndromic neurodevelopmental disorder with corpus collosum, axon, cardiac, ocular, and genital defects. *Am J Hum Genet*. 2019;105(4):854-868. doi:10.1016/j.ajhg.2019.09.005

**45**. Lam M, Chen CY, Li Z, et al; Schizophrenia Working Group of the Psychiatric Genomics Consortium; Indonesia Schizophrenia Consortium; Genetic REsearch on schizophreniA neTwork-China and the Netherlands (GREAT-CN). Comparative genetic architectures of schizophrenia in East Asian and European populations. *Nat Genet*. 2019;51(12): 1670-1678. doi:10.1038/s41588-019-0512-x

**46**. Ikeda M, Takahashi A, Kamatani Y, et al. Genome-wide association study detected novel susceptibility genes for schizophrenia and shared trans-populations/diseases genetic effect. *Schizophr Bull*. 2019;45(4):824-834. doi:10.1093/ schbul/sby140

**47**. Stahl EA, Breen G, Forstner AJ, et al; eQTLGen Consortium; BIOS Consortium; Bipolar Disorder Working Group of the Psychiatric Genomics Consortium. Genome-wide association study identifies 30 loci associated with bipolar disorder. *Nat Genet.* 2019;51(5):793-803. doi:10.1038/s41588-019-0397-8

**48**. Watson HJ, Yilmaz Z, Thornton LM, et al; Anorexia Nervosa Genetics Initiative; Eating Disorders Working Group of the Psychiatric Genomics Consortium. Genome-wide association study identifies eight risk loci and implicates metabo-psychiatric origins for anorexia nervosa. *Nat Genet*. 2019;51(8):1207-1214. doi:10.1038/ s41588-019-0439-2

**49**. Schizophrenia Working Group of the Psychiatric Genomics Consortium. Biological insights from 108 schizophrenia-associated genetic loci. *Nature*. 2014;511(7510):421-427. doi:10.1038/ nature13595

**50**. Okbay A, Baselmans BM, De Neve JE, et al; LifeLines Cohort Study. Genetic variants associated with subjective well-being, depressive symptoms, and neuroticism identified through genome-wide analyses. *Nat Genet*. 2016;48(6):624-633. doi:10.1038/ng.3552

**51**. Yengo L, Sidorenko J, Kemper KE, et al. Meta-analysis of genome-wide association studies for height and body mass index in ~700000 individuals of European ancestry. *Hum Mol Genet*. 2018;27(20):3641-3649. doi:10.1093/hmg/ddy271

**52**. Nelson CP, Goel A, Butterworth AS, et al. Association analyses based on false discovery rate implicate new loci for coronary artery disease. *Nat Genet*. 2017;49(9):1385-1391. doi:10.1038/ng.3913

**53.** Xue A, Wu Y, Zhu Z, et al. Genome-wide association analyses identify 143 risk variants and putative regulatory mechanisms for type 2 diabetes. *Nat Commun*. 2018;9(1):2941. doi:10.1038/s41467-018-04951-w

**54**. Akiyama M, Okada Y, Kanai M, et al. Genome-wide association study identifies 112 new loci for body mass index in the Japanese population. *Nat Genet*. 2017;49(10):1458-1467. doi:10.1038/ng.3951

**55.** Suzuki K, Akiyama M, Ishigaki K, et al. Identification of 28 new susceptibility loci for type 2 diabetes in the Japanese population. *Nat Genet*. 2019;51(3):379-386. doi:10.1038/s41588-018-0332-4

**56.** Bigdeli TB, Ripke S, Peterson RE, et al. Genetic effects influencing risk for major depressive disorder in China and Europe. *Transl Psychiatry*. 2017;7(3):e1074. doi:10.1038/tp.2016.292

**57**. Kuchenbaecker K, Telkar N, Reiker T, et al; Understanding Society Scientific Group. The transferability of lipid loci across African, Asian and European cohorts. *Nat Commun.* 2019;10(1):4330. doi:10.1038/s41467-019-12026-7

jamapsychiatry.com

**58**. Cai N, Revez JA, Adams MJ, et al; MDD Working Group of the Psychiatric Genomics Consortium. Minimal phenotyping yields genome-wide association signals of low specificity for major depression. *Nat Genet*. 2020;52(4):437-447. doi:10.1038/s41588-020-0594-5

**59**. Peterson RE, Cai N, Bigdeli TB, et al. The genetic architecture of major depressive disorder in Han Chinese women. *JAMA Psychiatry*. 2017;74(2): 162-168. doi:10.1001/jamapsychiatry.2016.3578

**60**. Huang Y, Liu Z, Wang H, et al. The China Mental Health Survey (CMHS): I. background, aims and measures. *Soc Psychiatry Psychiatr Epidemiol*. 2016; 51(11):1559-1569. doi:10.1007/s00127-016-1270-z

**61**. Tyrrell J, Mulugeta A, Wood AR, et al. Using genetics to understand the causal influence of higher BMI on depression. *Int J Epidemiol*. 2019;48 (3):834-848. doi:10.1093/ije/dyy223

**62**. Zhang Y, Qi G, Park JH, Chatterjee N. Estimation of complex effect-size distributions

using summary-level statistics from genome-wide association studies across 32 complex traits. *Nat Genet*. 2018;50(9):1318-1326. doi:10.1038/s41588-018-0193-x

**63**. Kendler KS. The dappled nature of causes of psychiatric illness: replacing the organic-functional/hardware-software dichotomy with empirically based pluralism. *Mol Psychiatry*. 2012;17(4):377-388. doi:10.1038/mp.2011.182

**64**. Dunn EC, Brown RC, Dai Y, et al. Genetic determinants of depression: recent findings and future directions. *Harv Rev Psychiatry*. 2015;23(1): 1-18. doi:10.1097/HRP.0000000000000054

**65**. Tam V, Patel N, Turcotte M, Bossé Y, Paré G, Meyre D. Benefits and limitations of genome-wide association studies. *Nat Rev Genet*. 2019;20(8): 467-484. doi:10.1038/s41576-019-0127-1

**66**. Walters RK, Polimanti R, Johnson EC, et al; 23andMe Research Team. Transancestral GWAS of

alcohol dependence reveals common genetic underpinnings with psychiatric disorders. *Nat Neurosci.* 2018;21(12):1656-1669. doi:10.1038/s41593-018-0275-1

**67**. Duncan LE, Ratanatharathorn A, Aiello AE, et al. Largest GWAS of PTSD (N=20 070) yields genetic overlap with schizophrenia and sex differences in heritability. *Mol Psychiatry*. 2018;23 (3):666-673. doi:10.1038/mp.2017.77

**68**. Hindorff LA, Bonham VL, Brody LC, et al. Prioritizing diversity in human genomics research. *Nat Rev Genet*. 2018;19(3):175-185. doi:10.1038/nrg. 2017.89

**69**. Martin AR, Kanai M, Kamatani Y, Okada Y, Neale BM, Daly MJ. Clinical use of current polygenic risk scores may exacerbate health disparities. *Nat Genet*. 2019;51(4):584-591. doi:10.1038/s41588-019-0379-x

# **Supplementary Online Content**

Giannakopoulou O, Lin K, Meng X, et al; for the 23andMe Research Team, China Kadoorie Biobank Collaborative Group, and Major Depressive Disorder Working Group of the Psychiatric Genomics Consortium. The genetic architecture of depression in individuals of East Asian ancestry. Published online September 29, 2021. *JAMA Psychiatr.* doi:10.1001/jamapsychiatry.2021.2099

eAppendix 1. Additional Information

**eFigure 1.** Quantile-quantile Plot Illustrating the GWAS Meta-Analysis for Depression in 15,771 Individuals With Depression and 178,777 Individuals with East Asian Ancestry

**eFigure 2.** Forest Plot for rs4656484 Which Was Genome-Wide Significant in the Depression East Asian Meta-Analysis Based on all Studies

**eFigure 3.** Forest Plots of rs10240457 Which Was Genome-Wide Significant in the Depression Meta-Analysis of Studies Based in East Asian Countries

**eFigure 4.** Quantile-Quantile Plot Illustrating the Meta-Analysis of East Asian Results for Depression With the Largest GWAS in Europeans (Howard et al., 2019)

eFigure 5. Forest Plots for the Two Previously Reported Depression Loci Based on the Chinese CONVERGE Study

**eFigure 6.** Effect Estimates for Depression of Previously Reported Depression Loci in the Discovery European Study vs in the East Asian Meta-Analysis

**eFigure 7.** Genetic Correlations Between the Clinical and Symptom-Based Depression Phenotypes in East Asians and Other Traits in Europeans

**eTable 1.** Descriptive Characteristics of the Datasets Included in This Study *provided in the* separate excel file

**eTable 2.** Details of the Genotyping for Each Dataset Included in the Discovery East Asian Meta-Analysis for Depression

**eTable 3.** Variants Significantly Associated With Depression ( $P<10^{-5}$ ) in the East Asian Discovery Meta-Analysis and Their Results in the Largest Depression GWAS in Europeans (Howard et al., 2019) *provided in the separate excel file* 

**eTable 4.** Variants Associated at P<10<sup>-5</sup> in the Depression GWAS Restricted to East Asia Based Studies vs Their Results in the USA/UK-Based Studies *provided in the separate excel file* 

**eTable 5.** Loci That Reached the Suggestive Significance Threshold ( $P<10^{-5}$ ) in Either of the Outcome-Specific Analyses in East Asian Ancestry Samples *provided in the separate excel file* 

**eTable 6.** Variants Associated With Depression ( $P < 5x10^{-8}$ ) in the Meta-Analysis of the Broad Depression Outcome in East Asian Ancestry Samples and the Largest Depression GWAS in European Ancestry Samples (Howard et al., 2019) *provided in the separate excel file* 

**eTable 7.** The Two Genome-Wide Significant Depression Loci in CONVERGE and the Relevant Results in the Other East Asian Ancestry Datasets of the Current Study and the Two Largest European Studies

**eTable 8.** The Association of Previously Reported Variants for Depression With  $P < 5x10^{-8}$  in European Ancestry Samples (Howard et al., 2019) in the East Asian Discovery Meta-Analysis *provided in the separate excel file* 

**eTable 9.** Reproducibility of Established Depression Loci From Howard et al.,2019 in Independent Samples of European Ancestry and in the East Asian Depression GWAS

eTable 10. SNP-Heritabilities for the Different Depression-Definition Outcomes Considered in This Study

**eTable 11.** Transancestry Genetic Correlation Estimates for Diverse Phenotypes Between Samples With East Asian and European Ancestry

**eTable 12.** Transancestry Genetic Correlations of Clinical and Symptom-Based Depression in East Asian Datasets With Other Traits, Based on European Studies

**eTable 13.** Genetic Correlations of Clinical and Symptom-Based Depression in European Datasets With Other Traits

**eTable 14.** Genetic Correlations of Clinical and Symptom-Based Depression in East Asian Datasets With Other Traits, Based on East Asian Studies

# eReferences

This supplementary material has been provided by the authors to give readers additional information about their work.

# eAppendix 1. Additional Information

#### Supplementary Methods

Raw genotype data were available for China Kadoorie Biobank (CKB), UK Biobank (UKB), Intern Health Study (IHS), Women's Health Initiative (WHI) and Army Study To Assess Risk and Resilience in Service members (Army-STARRS) study. Summary statistics were available for China Oxford and VCU Experimental Research on Genetic Epidemiology (CONVERGE) study, Bio*Me*, Taiwan-Major Depressive Disorder (MDD) study and 23andMe cohort. We did not assess whether there is sample overlap between studies because given their different design and area of recruitment sample overlap is extremely unlikely.

This investigation was based on EAS participants which was defined by the investigators based on genetic information. For each study a principal component analysis was carried out based on the genetic similarity of pairs of individuals. Individuals that clustered around a reference group with confirmed East Asian ancestry were included in this analysis.

#### **Studies description**

#### A. China Kadoorie Biobank (CKB)

The CKB is a large population dataset of more than 510,000 individuals from 10 geographically defined regions of China, with extensive clinical, lifestyle, dietary, medical history and genetic data<sup>1</sup>. All the participants were interviewed at the baseline by trained staff, while periodic re-surveys have been conducted in ~25,000 surviving participants. Health outcomes of the participants provided through linkages with established registries and health insurance databases are also available.

A total of 17,723 participants reported that had experienced at least one Composite International Diagnostic Interview (CIDI) -A trigger symptom (i.e., feeling sad/depressed, loss of appetite, loss of interest or feeling worthless) for two or more weeks during the past year and were categorized as having "symptom-based" depression in our analyses. These participants were further assessed for major depression (MD) using the Chinese version of the CIDI-short form by trained clinicians at study clinics. Participants were defined as having past year MD if they had felt sad, blue, or depressed for  $\geq 2$  weeks during the past 12 months, accompanied by at least 3 of 7 additional symptoms, including weight/appetite change, sleep problems, loss of interest and pleasure, loss of energy or fatigue, concentration problems, feelings of guilt or worthlessness, and thoughts of suicide. In our analysis, 4,500 participants who fulfilled the past year MD CIDI-criteria, had at least one relevant medical record (ICD10 F32, F33, F34.1, F38.1 codes) during the follow-up period or reported at resurvey 2 that have been ever diagnosed by a doctor with depression were classified as having "lifetime diagnosis of MD". Participants that had never been diagnosed with MDD (either diagnosed by CIDI-A questionnaire, self-reported depression or had a medical diagnosis of depression (F32, F33, F34.1, F38.1)) or with neurasthenia and did not report any MDD symptoms constituted the control group (~70,000) in all our analyses. Further exclusions from both cases and controls groups included participants with a medical diagnosis for dementia, psychosis, bipolar disorder, mental retardation and pervasive developmental disorders.

A total of 102,783 participants have been genotyped using 2 custom-designed Affymetrix Axiom arrays including up to 803,000 variants, optimised for genome-wide coverage in Chinese populations. Stringent quality control (QC) included SNP call rate > 0.98, plate effect P > 10<sup>-6</sup>, batch effect P > 10<sup>-6</sup>, Hardy-Weinberg Equilibrium (HWE) deviations P > 10<sup>-6</sup> (combined 10df  $\chi$ 2 test from 10 regions), biallelic, Minor Allele Frequency (MAF) difference from 1000 Genomes East-Asian frequencies < 0.2, sample call rate > 0.95, heterozygosity < mean + 3 standard deviation (SD), no sex chromosomes aneuploidy, genetically-determined sex concordant with database, resulting in genotypes for 532,415 variants present on both array versions. Genotypes were imputed to the 1,000 Genomes Phase 3 reference (EAS MAF > 0) using SHAPEIT version 3 and IMPUTE version 4.

A total of 5,376 symptom-based depression cases (1,305 participants with lifetime diagnosis) and 69,998 controls have been genotyped. A linear mixed model (SAIGE) was implemented for the association with depression, adjusting

for age, sex, principal components (PCs) and recruitment region. After filtering variants with effective sample size  $(Neff) < 50^2$  and poorly imputed variants (info<0.7), 10,834,708 variants were included in the downstream analyses.

# **B.** China, Oxford and Virginia Commonwealth University Experimental Research on Genetic Epidemiology cohort (CONVERGE)

The CONVERGE cohort of Han Chinese women has been previously described<sup>3</sup>. Briefly, ~5,000 cases of recurrent MDD ( $\geq 2$  episodes), established with the CIDI, which used DSM-IV criteria, were analysed against an equal number of controls. Cases with medical history of bipolar disorder, psychosis, mental retardation and/or drug or alcohol abuse before their first depressive episode were excluded from the study.

CONVERGE samples underwent whole-genome sequencing, as previously described<sup>3</sup>. In brief, after genotyping calling, two rounds of imputation were performed: first without a reference panel and then using the 1000Genomes Phase 1 Asian haplotypes. Variants with a) a P-value for violation  $HWE < 10^{-6}$ , b) information score < 0.9 and c) MAF in CONVERGE < 0.5% were excluded from the GWAS, resulting in a final set of 5,987,610 SNPs. The GWAS was conducted with a mixed-linear model including a genetic relationship matrix (FastLMM version 2.06.20130802) as random effect and PCs from eigen-decomposition of this matrix as fixed effects. We further filtered the publicly available GWAS summary statistics by removing variants with Neff less than 50.

# C. 23andMe cohort

The GWAS dataset of personal genetic company 23andMe, Inc. (Sunnyvale, CA) that included in this meta-analysis, encompassed 2,729 depression cases and 90,310 controls of East Asian ancestry. All participants provided informed consent and answered surveys online according to 23andMe's human subject protocol, which was received and approved by Ethical & Independent Review Services, an AAHRPP-accredited institutional review board. As part the medical history survey, participants were asked if they have ever received a clinical diagnosis or treatment for depression (binary variable).

DNA extraction and genotyping were performed on saliva samples by National Genetics Institute (NGI), a CLIA licensed clinical laboratory and a subsidiary of Laboratory Corporation of America. Samples were genotyped on one of five genotyping platforms. The v1 and v2 platforms were variants of the Illumina HumanHap550+ BeadChip, including about 25,000 custom SNPs selected by 23andMe, with a total of about 560,000 SNPs. The v3 platform was based on the Illumina OmniExpress+ BeadChip, with custom content to improve the overlap with our v2 array, with a total of about 950,000 SNPs. The v4 platform was a fully customized array, including a lower redundancy subset of v2 and v3 SNPs with additional coverage of lower-frequency coding variation, and about 570,000 SNPs. The v5 platform (68.4% of the samples in the East-Asian dataset), is an Illumina Infinium Global Screening Array (~640,000 SNPs) supplemented with ~50,000 SNPs of custom content. This array was specifically designed to better capture global genetic diversity and to help standardize the platform for genetic research.

Imputation was performed with Minimac3 using a reference panel combining the May 2015 release of the 1000 Genomes Phase 3 haplotypes with the UK10 imputation reference panel. The association testing was performed by logistic regression assuming additive allelic effects, adjusting for age, sex, the top five principal components to account for residual population structure and indicators for genotype platforms to account for genotype batch effects. The association analysis and the downstream quality control was conducted separately for the genotyped and the imputed SNPs.

Genotyped GWAS results were filtered for: SNPs that were only genotyped on "v1" and/or "v2" platforms due to small sample size, SNPs on chrM or chrY, SNPs that failed a test for parent-offspring transmission, SNPs with fitted  $\beta$ <0.6 and P<10<sup>-20</sup> for a test of  $\beta$ <1, SNPs with a Hardy-Weinberg P<10<sup>-20</sup>, or a call rate of <90%, SNPs with genotype date effects (determined as P<10<sup>-50</sup> by ANOVA of SNP genotypes against a factor dividing genotyping date into 20 roughly equal-sized buckets), SNPs with large sex effect (ANOVA of SNP genotypes, r2>0.1), SNPs with probes matching multiple genomic positions in the reference genome and variants with minor allele counts in the controls less than 50.

For imputed GWAS results, SNPs with poor imputation quality (rsq<0.7), Neff less than 50 and SNPs that had strong evidence of a platform batch effect were excluded from the downstream analysis. The batch effect test is an F test from an ANOVA of the SNP dosages against a factor representing v4 or v5 platform ( $P<10^{-50}$ ).

Across all results, further filtering was performed on SNPs that have an available sample size of less than 20% of the total GWAS sample size, logistic regression results that did not converge due to complete separation, identified by abs(effect)>10 or stderr>10 on the log odds scale.

# D. Taiwan-Major Depressive Disorder (MDD) Study

MDD patients were included from a family study of mood disorders in Taiwan. Patients aged between 18 to 70 years, who met diagnostic criteria of MDD using the Diagnostic and Statistical Manual of Mental Disorders, fourth edition (DSM-IV) were consecutively referred by psychiatrists in clinical settings. Exclusion criteria include patients diagnosed with schizophrenia, schizoaffective or substance-induced mood disorders. The community-recruited Taiwan Biobank Dataset was used as the control group. The control group was further filtered by excluding subjects who have self-reported bipolar disorder (BPD), postpartum depression, alcoholism or drug addiction, schizophrenia, Parkinson's disease or dementia. Moreover, subjects in Taiwan Biobank Data who had self-reported diagnosis of MDD were classified into case (MDD) group. Sample collection procedures and detailed information about Taiwan Biobank were described elsewhere<sup>4</sup>. Both MDD and control subjects were Han Chinese.

Genotyping for Taiwan MDD cases was obtained using Affymetrix CHB Array with 642,832 genetic variants, Affymetrix TWB1.0 Array with 642,545 variants, Illumina Human Omni Express Exiome Beadchips with 949,974 variants and Affymetrix TWB2.0 Array with 689,688 variants. Genotyping for Taiwan Biobank controls was obtained using Affymetrix TWB1.0 Array with 646,735 variants and Affymetrix TWB2.0 Array with 686,439 variants. Owing to Affymetrix TWB2.0 is a very unique array specifically designed for Taiwanese, which is very different from other platforms, imputation was performed separately. One set of imputation was done for Affymetrix TWB2.0 array only, the other set of the imputation was done with combining all other arrays, including Affymetrix CHB, TWB1.0, and Illumina arrays using common SNPs across platforms. The overlapping variants of Affymetrix TWB2.0 array and all other platforms were around 28,000. Imputation was conducted by Michigan Imputation Server using 1000G phase 3 v5 as a reference panel, Eagle v2.3 for phasing, and EAS population for QC. Samples that did not meet the 95% threshold of call rate, kinship-pairs and outliers in population stratification were removed. Genetic variants with call rate <95%, MAF <0.01, p-value of HWE <10<sup>-6</sup> were also excluded. The GWAS was performed using PLINK 1.9 and adjusted for 5 ancestry principal components. The GWA analysis was conducted separately by platforms with (1) Affymetrix TWB2.0 and (2) all other platforms combined together. In the latter, variants significantly associated (P<0.005) with genotyping platforms were excluded from downstream analysis. We also used a stricter imputation threshold for filtering (info<0.9 instead of 0.7).

# E. Women's Health Initiative study (WHI)

The WHI study is a long-term national health study in U.S conducted in postmenopausal women, enrolled either in a clinical trial or an observational study<sup>5</sup>. We analysed data from 3,492 women with Asian ancestry who were genotyped as part of the WHI – Population Architecture using Genomics and Epidemiology (PAGE) sub-study. These participants had agreed their data to be included in the database of Genotypes and Phenotypes (dbGaP). The genotype and phenotype data were assessed vid dbGaP study accession phs000200.v12.p3. Depressive symptoms in the past week were assessed in the baseline visit with a 6-item Center for Epidemiological Studies Depression Scale (CES-D) form. Based on Smoller et al., definitions<sup>6</sup>, participants with a score of 5 or more were considered as depression cases, while participants not classified as currently depressed (6-item CES-D), without medical history of depression (2-item Diagnostic Interview Schedule) and not on antidepressant therapy constituted the control group.

The dataset of Asian participants of WHI included in our analyses, have been genotyped with CardioMetaboChip, as part of the NHGRI's PAGE project. Samples and variants with a call rate lower than 95%, typed variants with different missingness rates between case and control group > 0.2 and variants with MAF < 0.05 were excluded from downstream analysis. A logistic regression analysis was performed (PLINK2), adjusting for age, sex, 20 PCs and study subgroup.

# F. Intern Health Study (IHS)

We also considered participants from IHS, a multi-institutional longitudinal cohort study of medical interns in U.S. The study design has been previously described<sup>7</sup>. Depressive symptoms were measured through the PHQ-9 questionnaire, a self-report component of the primary care evaluation of mental disorders inventory. Subjects were asked to complete the questionnaire assessing PHQ-9 depressive symptoms in the baseline survey, as well as at months 3, 6, 9 and 12 of their internship year. Participants with a PHQ-9 score of 10 or greater<sup>8</sup> during their internship were considered as depression cases in this study. A total of 294 depression cases and 544 controls were considered in this association study.

IHS samples were genotyped on Illumina Infinium CoreExome v1.0 or v1.1 array. Quality control steps and imputation were performed using the Ricopili Rapid Imputation Consortium Pipeline<sup>9</sup>. Study samples were assigned into distinct ancestry groups based on PCs derived from the study samples combined with 1000Genomes reference panel. In brief, samples with call rate < 98% or samples with a gender mismatch between genotype and reported data were excluded. For duplicated samples and up to third-degree relatives, the sample with higher call rate was selected. Variants with call rate < 98%, missing difference > 0.20 were also excluded prior imputation. Genotypes were imputed to the Haplotype Reference Consortium (HRC) reference panel using EAGLE and IMPUTE2 for the phasing and the imputation respectively. A logistic regression analysis was performed (PLINK2) in genotype dosages, adjusting for age, sex, 20 first PCs. Variants with MAF < 0.05 and imputation info score < 0.7 were excluded from downstream analysis, resulting in a dataset of 4,626,568 variants.

# G. UK Biobank (UKB)

UKB is a well-characterized cohort of more than 500,000 individuals recruited at UK between 2006-2010 with linked health and genetic data<sup>10</sup>. A subset of participants has also completed the mental-health questionnaire. We used a combination of hospital diagnoses (ICD10 codes) and lifetime CIDI (A. prolonged feelings of depression OR prolonged loss of interest in normal activities AND B. affected more than half of the day during worst episode of depression AND C. the frequency of depressed days during worst episode was at almost every day/every day AND D. these problems interfered with your life/activities (study/employment, childcare and housework, leisure pursuits) somewhat/a lot) to define our cases. Gender mismatches, missingness/heterozygosity outliers, participants with excessive genetic relatedness, no quality control metrics, individuals that have withdrawn their consent and up to 2nd degree relatives (PC-Relate) were excluded before the analysis.

UKB genotyping was conducted by Affymetrix using two similar arrays; Applied Biosystems<sup>TM</sup> UK BiLEVE Axiom<sup>TM</sup> Array, consisting of 807,411 genetic variants and a bespoke UK Biobank Axiom<sup>TM</sup> array, including 825,927 genetic variants. All genetic data was quality controlled by UKBB bioinformatics team, both at sample and marker level, resulting in a dataset of 488,377 samples and 805,426 variants from both arrays. The genetic data was subsequently imputed by UKB to over 90 million SNPs, indels and large structural variants, using haplotypes of both British, European and diverse-ancestry populations. For this study, we used data imputed with both the HRC and the merged UK10K and 1000Genomes Phase 3 reference panels<sup>10</sup>. To assign individuals in ancestry groups based on their genetic information, we implemented the PC-AiR method to perform a PC analysis for the detection of population structure<sup>11</sup>. A logistic regression analysis was performed in imputed genetic dataset (PLINK2), adjusting for age, sex, genotyping array and PCs that were calculated based on the subset of genetically defined EAS participants. Downstream analysis was restricted in the subset of common (MAF > 0.05) and well-imputed (> 0.7) variants. The analysis conducted under UK Biobank application 51119.

# H. Army Study To Assess Risk and Resilience in Service members (Army STARRS) study

Data from the Army-STARRS, a study conducted in army members in USA, were also assessed in the current analysis. Army STARRS includes the New Soldier Study (NSS) and the Pre/Pst Deployment Study (PPDS). Detailed information about the design of the study have been published previously<sup>12</sup>. Depression outcomes were measured with the CIDI screening scales and evaluated for concordance with DSM-IV diagnoses within the Army STARRS clinical reappraisal study<sup>13</sup>.

The genotyping and imputation of Army-STARRS, New Soldier Study (NSS) samples has been described previously<sup>14</sup>. In brief, samples were genotyped using the Illumina OmniExpress and Exome array and were imputed on a reference multi-ancestry panel from the 1000G Genomes Project (phase1). Samples and genetic variants with a call rate less than 95% and 98% respectively were filtered out. A logistic regression analysis was performed in common and well-imputed variants (PLINK2), adjusting for age, sex and the 20 first PCs.

#### I. BioMe

Bio*Me* is an electronic medical record-linked biobank of more than 50,00 participants from the Mount Sinai Health System<sup>15</sup>. Bio*Me* cases were individuals with a medical depression diagnosis (ICD9 296.2, 296.3, 296.82, 298.0, 300.4, 301.12, 311; ICD10 F32, F33, F34.1, F38.1). Participants diagnosed with dementia, bipolar or manic disorder, developmental disorders, intellectual disability, psychotic disorder, personality disorder were excluded from this study.

Bio*Me* samples were genotyped with the Infinium Global Screening Array (GSA) BeadChip. Individuals with population-specific heterozygosity rate that surpassed +/- 6 standard deviations of the population-specific mean, along with individuals with a call rate of <95%, individuals with discordant reported and genetic sex and with phenotypically intermediate sex were not considered in the analysis. In cases of duplicates, the sample of each pair with the lower missingness rate in the exomic data was preferentially excluded. Genetic variants exclusions included a call rate <95% and HWE p <  $10^{-5}$ . The resulting dataset was imputed to the 100Genomes Phase 3 reference panel. The GWAS was performed with a binary mixed model (SAIGE). The first 20 PCs were calculated using PLINK (v1.9) and a genomic relationship matrix (GRM) was calculated using the KING (v1.4) software (-ibs). The PCA and GRM calculations were restricted to common (MAF>0.01), autosomal sites. Additionally, variants with MAF<0.05 and info<0.07 were excluded before the meta-analysis.

#### Data availability statement

Summary statistics for the combined EAS meta-analysis excluding the 23andMe study are available through the PGC website (http://www.med.unc.edu/pgc/downloads). The genome-wide summary statistics for CONVERGE and the European meta-analysis are also available on the PGC website. Uploading and sharing of individual genetic data from CKB are subject to restrictions according to the Interim Measures for the Administration of Human Genetic Resources administered by the Human Genetic Resources Administration of China (HGRAC). Summary data including allele frequencies and GWAS summary statistics are available by application and restricted to research-related purposes. Other individual-level CKB data are available through www.ckbiobank.org, subject to completion of a Material Transfer Agreement, either through Open Access or on application. CKB data access is subject to oversight by an independent Data Access Committee. Analyses using CKB data were conducted under research approval 2018-0018. Data from 23andMe, Inc were made available under a data use agreement that protects participant privacy. Please visit https://research.23andme.com/collaborate/#dataset-access for more information and to apply to access the data. The raw genetic and phenotypic UK Biobank data used in this study, which were used under license (application number 51119), are available from: http://www.ukbiobank.ac.uk/. The genotype and phenotype data for the WHI study can be requested via dbGaP study accession phs000200.v12.p3.

# Genotyping

The genotyping of each study has been previously described <sup>3, 4, 10, 14, 16</sup>. To optimise genome-wide coverage in EAS populations, genotyping was carried out using two custom-designed Affymetrix Axiom arrays in CKB and the Affymetrix TWB2.0 array for a subset of the Taiwan-Major Depressive Disorder study samples <sup>1, 4</sup>. CONVERGE used whole-genome sequencing with a mean depth of 1.7<sup>3</sup>. More detail for all studies is provided in the studies description above.

### **Quality control**

Quality control and association analyses were carried out separately for each study as described in the studies description and Supplementary Table 2. Genotypes were imputed to 1000 Genomes Project reference panel, except IHS where the Haplotype Reference Consortium (HRC) was used, 23andMe and UKB where the 1000 Genomes data were combined with the UK10K and HRC imputation reference panel, respectively. In the meta-analysis, we included only well-imputed variants (imputation accuracy > 0.7) with effective sample size (N<sub>eff</sub>) equal or higher than  $50^2$  in the larger datasets (CONVERGE, CKB, 23andMe), and with minor allele frequency (MAF)>=0.05 in the other studies. For the Taiwan-MDD study an imputation accuracy threshold of 0.9 was used.

#### Meta-analysis

We performed a Z-score weighted meta-analysis using METAL<sup>33</sup> for 13,163,200 genetic variants (Supplementary Figure 1). For all meta-analyses, results were restricted to variants present in at least two studies. We also performed a Z-score weighted meta-analysis combining results from our EAS analysis and the publicly available summary statistics from the largest published GWAS in EUR samples<sup>17</sup>. Variants associated at genome-wide significance in this trans-ancestry meta-analysis were considered novel if they were located outside  $\pm 250$ kb either side of the lead variants from the published GWAS of depression in EUR and if the Linkage Disequilibrium (LD) with the lead variant was <0.01<sup>17</sup>. We calculated betas for the meta-analyses using the formula from Zhu et al.<sup>18</sup>. Odds ratios were based on an inverse-variance weighted meta-analysis of the study betas, where for CONVERGE we used results from a logistic regression in Plink instead of FastLMM.

#### Functional annotation and gene-based association analysis

We functionally annotated the lead variants and their proxies ( $r^{2}\geq0.8$ ). Gene-based association analysis was performed using MAGMA (v1.08), implemented in FUMA, with default settings<sup>19, 20</sup>. SNPs were mapped to 19,575 protein coding genes from Ensembl build 85. Significance for the gene-based analysis was defined as the Bonferroni corrected threshold (P=2.6x10<sup>-6</sup>).

We functionally annotated the lead SNPs in the genomic regions associated with increased risk for depression using HaploReg v4<sup>21</sup> and Open Targets Genetics Platfrom<sup>22</sup>. Candidate genes for each locus associated with depression were selected based on their proximity to the lead variant and/or the evidence of eQTL associations for a gene in that region. Open Targets Genetics interrogates various data sources to link genetic variation to genetic expression. The GeneCards database was used to obtain summary information of the identified genes, while NCBI's PubMed database was used to interrogate literature related to gene function and association with other human traits/diseases. We queried the identified variants and their proxies in PhenoScanner<sup>23</sup> and the NHGRI-EBI GWAS catalogue<sup>24</sup> to investigate trait pleiotropy.

#### **Reproducibility of established depression loci**

We assessed whether the associations of 102 established depression loci from the largest published EUR GWAS<sup>17</sup> were reproducible in samples with EAS ancestry. Since the lead SNP might not be the causal variant nor correlated with it in other ancestry groups due to LD differences, we also formed credible sets that are likely to include the causal variant. These were based on all variants in LD with the lead variant of a locus ( $r^2>0.6$ ) based on an ancestry matched reference (1000 Genomes Project v3 EUR samples). We assessed whether any variant in the credible set displayed evidence of association in the target study. As these credible sets contained multiple SNPs, we used a p-value threshold of P<0.01 to indicate reproducibility. While this p-value threshold might not provide conclusive evidence of reproducibility for individual loci, we used it to test reproducibility rates across sets of loci.

We estimated the number of associations out of the 102 established loci that were expected to replicate. We accounted for the sample size of our study and the allele frequency in EAS populations. First, we calculated the power<sup>25</sup> to observe an association in the EAS meta-analysis for each of the 102 loci at alpha error of 0.05 using the effect estimate from the EUR discovery study<sup>8</sup>, the allele frequency for EAS samples from 1000 Genomes and the sample size available in the EAS meta-analysis. By summing up the probabilities across the 102 loci, we derived the absolute number of associations out of the 102 we are powered to observe if the effect estimates in EAS are consistent with the ones from the EUR studies. For benchmarking, we also assessed the reproducibility of these established loci in ancestry-matched cohorts. We used independent EUR GWAS for depression with different sample sizes (Bio*Me*, BioVU, FinnGen<sup>26</sup>, 23andMe).

#### Heritability and genetic correlations

We estimated the SNP heritability ( $h^2$ ) for each depression phenotype in EAS (meta-analysed cohorts) using used LD score (LDSC) regression<sup>27</sup>. We also used bivariate GREML implemented in the GCTA software<sup>28</sup> to estimate  $h^2$  for the two large Chinese datasets, CONVERGE and CKB (symptom-based definition), that contribute the majority of samples in our analysis for which genotype data were available. For this we excluded, related individuals and used hard-calls for variants with call rate>0.95 and MAF>0.01. For this analysis we used a variety of prevalence estimates, ranging from 6.5%<sup>29</sup> to 15%<sup>30</sup>.

To characterise the genetic architecture of depression, we estimated genetic correlations between depression in EAS and EUR studies. For clinical depression in EUR samples, we used the summary statistics from 45,396 cases with DSM-based diagnosis of major depressive disorder and 97,250 controls from a meta-analysis of 33 independent cohorts included in the latest GWAS<sup>17</sup>, excluding UKB and 23andMe. Additionally, we generated a symptom-based definition for EUR samples using the PHQ-9 questionnaire and a cut-off score of 10<sup>31</sup>, yielding 6,510 affected individuals and 116,697 controls from UK Biobank<sup>10, 32</sup>.

To assess the sharing of genetic risk factors for depression across the genome between the two populations, we estimated trans-ancestry genetic correlations using POPCORN<sup>33</sup>. We estimated the genetic effect correlation which compares effects independent of allele frequency differences between the two populations. LDSC was also used to estimate genetic correlations between different outcomes within each ancestry group. The default LD Scores computed using 1000 Genomes EAS data were used as a reference for the LD estimates. We also assessed the genetic overlap with other traits using publicly available summary statistics (PGC, NHGRI-EBI GWAS catalogue) from EAS and EUR populations, using LDSC and POPCORN respectively, as described above. We only present genetic correlation estimates where the standard error (SE) was less than 0.3.

To aid interpretation of the trans-ancestry genetic correlations, we also gathered estimates for other traits. We extracted genetic correlations between EUR and EAS from publications<sup>34-37</sup>. Additionally, we used publicly available summary statistics from Biobank Japan<sup>38, 39</sup> and EUR GWASs to estimate correlations for coronary artery disease (CAD)<sup>40</sup>, breast cancer<sup>41</sup> and age at menarche<sup>42</sup> using POPCORN as outlined above.

#### **Supplementary results**

# **Characterisation of novel loci**

Variant rs4656484 at a previously unreported locus, 1q24.1, was associated with depression with  $P=4.4 \times 10^{-8}$  (beta for C allele=-0.018, SE=0.003, effect allele frequency (EAF)=0.635) (Table 1). In the UK Brain Expression Consortium resource (UKBEC)<sup>43</sup> rs4656484 was associated with expression of *LMX1A* (LIM Homeobox Transcription Factor 1 Alpha), which has been linked to dopamine neuron development<sup>44</sup>. The tissue group showing the strongest eQTL association was frontal cortex ( $P=1.1 \times 10^{-4}$ ). In GTEx and ROSMAP<sup>45</sup>, rs4556484 showed significant eQTL association with *FAM78B* (Family with sequence similarity 78 member B) in thyroid (GTEx,  $P=7.7 \times 10^{-5}$ ), cortex

(GTEx, P=0.046) and brain (ROSMAP, P=0.001). FAM78B forms a ribonucleoprotein complex, which shuttles RNA between the nucleus and cytosol<sup>46</sup>.

A novel locus at 7p21.2 was associated with depression at genome-wide significance in the analysis of the East Asia based studies (Table 1). The lead SNP, rs10240457 (EAF=0.646, beta for A-allele=0.028, SE=0.005, P= $5.0x10^{-9}$ ) is intronic to *AGMO* (Alkylglycerol Monooxygenase). This gene cleaves the O-alkyl bond of ether lipids which are essential components of brain membranes and function in cell-signalling and other critical biological processes.

We carried out a meta-analysis for the broad depression outcome in EAS and the largest GWAS of depression in EUR samples<sup>17</sup> (Figure 1B, Supplementary Figure 4). The lead variant at 1q25.2, rs7548487, (beta for A allele= -0.013, SE=0.002, P=1.29x10<sup>-8</sup>) is located in an intron of *ASTN1* (astrotactin 1). Astrotactin is a neuronal adhesion molecule required for glial-guided migration of young postmitotic neuroblasts in cortical regions of the developing brain<sup>47</sup>. The C-allele of the lead variant at 18q12.1, rs547488 had beta 0.008 (SE=0.001) and P=3.3x10<sup>-8</sup>. It is located downstream of *CDH2* (cadherin 2) and is nominally associated with the expression of *CDH2* in the brain (UKBEC, P=0.03) and from BrainSeq<sup>48</sup> (P=0.027). CDH2 encodes N-cadherin, which expresses broadly in multiple tissues and has been shown to play a role in the development of the nervous system and be associated with neurodevelopmental disorders<sup>49</sup>. The third locus is 22q13.31 with lead variant rs12160976 (beta for A allele=-0.009, SE=0.002, P=1.6x10<sup>-8</sup>).

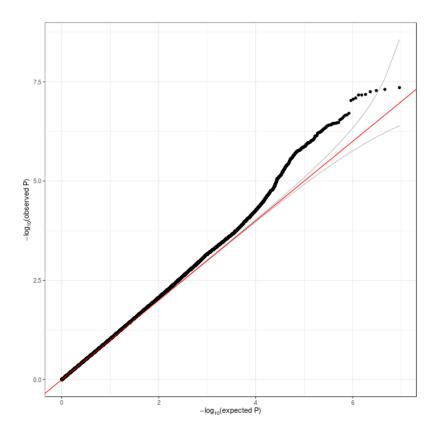
### **Gene-based analysis**

We also performed a gene-level aggregate test based on the meta-analysis summary statistics using MAGMA (v1.08), as implemented in FUMA<sup>20</sup>. The ETS Variant Transcription Factor 5 (3q27.2) gene, was the only gene that passed the significance threshold (P=6.9x10<sup>-6</sup>). It has been previously associated with depression risk in an EUR study<sup>50</sup>.

#### **Reproducibility**

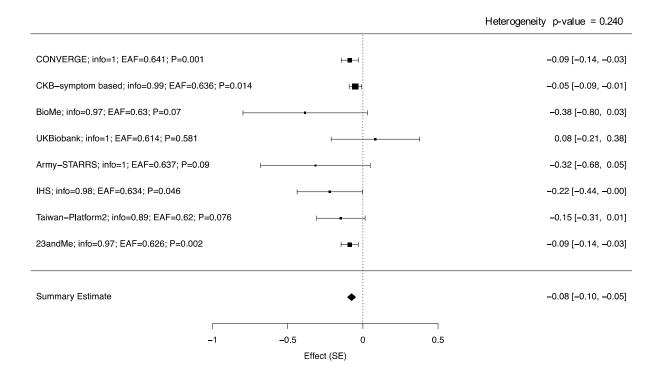
In addition to the comparisons described in the main manuscript, to rule out that the low reproducibility rates are due to differences in LD patterns between the ancestry groups, we created credible sets of SNPs that are likely to contain the causal variants and assessed their associations in the EAS data. Of the 102 credible sets, 13 (12.7%) contained variant(s) with P<0.01 in the EAS association analysis with depression. We also assessed a high-confidence set of loci from the largest EUR meta-analysis that were replicated in an independent dataset of 23andMe<sup>8</sup>. Out of the 86 which were available in the EAS meta-analysis, 13 (15.1%) of the credible sets contained a variant with P<0.01.

**eFigure 1.** Quantile-quantile Plot Illustrating the GWAS Meta-Analysis for Depression in 15,771 Individuals With Depression and 178,777 Controls with East Asian Ancestry



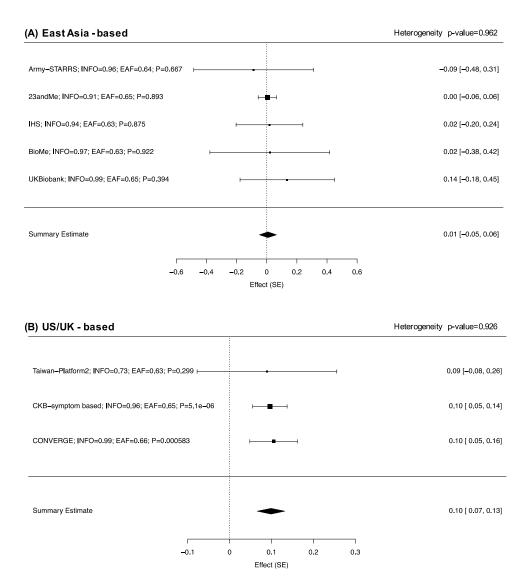
It shows the deviation of association test statistics (black dots) from the distribution expected under the null hypothesis (red line). The grey lines indicated the lower and upper 95% confidence bands. The inflation statistic was  $\lambda$ =1.035 and  $\lambda_{1000}$ =1.001 when scaled to a sample size of 1000 cases and 1000 controls (LDSC intercept 1.01 (0.01)).

**eFigure 2.** Forest Plot for rs4656484 Which Was Genome-Wide Significant in the Depression East Asian Meta-Analysis Based on all Studies



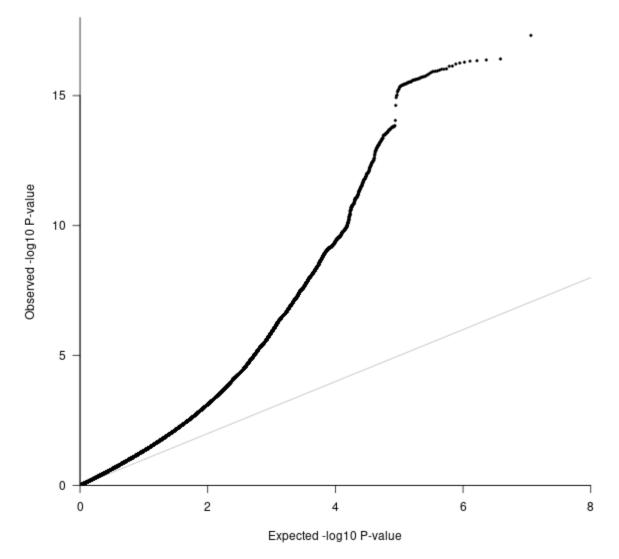
The plot shows the effect size estimates and associated confidence interval for each of the studies. The variant was not available in the Women's Health Initiative and Taiwan-Platform 1 datasets due to insufficient imputation quality. IHS=Intern Health Study; CKB=China Kadoorie Biobank (symptom-based depression outcome). INFO=imputation accuracy score; EAF=effect allele frequency, P=p-value for the association with depression in the study.

**eFigure 3.** Forest Plots of rs10240457 Which Was Genome-Wide Significant in the Depression Meta-Analysis of Studies Based in East Asian Countries



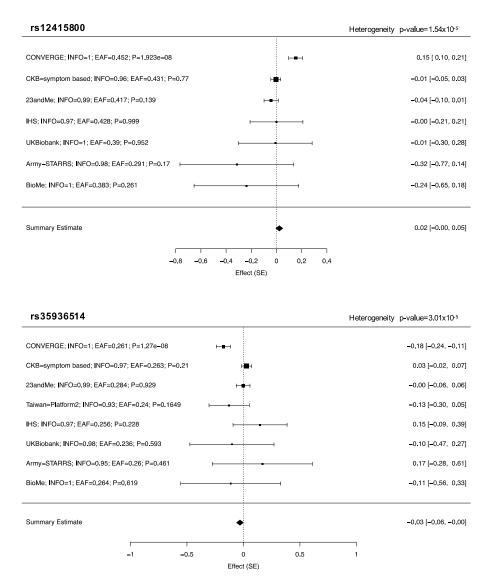
(A) effect size estimates and confidence interval for each of the studies in the East-Asia based meta-analysis and (B) results for the US/UK based studies with ancestrally East Asian samples. The variant was not available in WHI and Taiwan-Platform 1 datasets. IHS=Intern Health Study; CKB=China Kadoorie Biobank (symptom-based depression outcome).

**eFigure 4.** Quantile-Quantile Plot Illustrating the Meta-Analysis of East Asian Results for Depression With the Largest GWAS in Europeans (Howard et al., 2019)



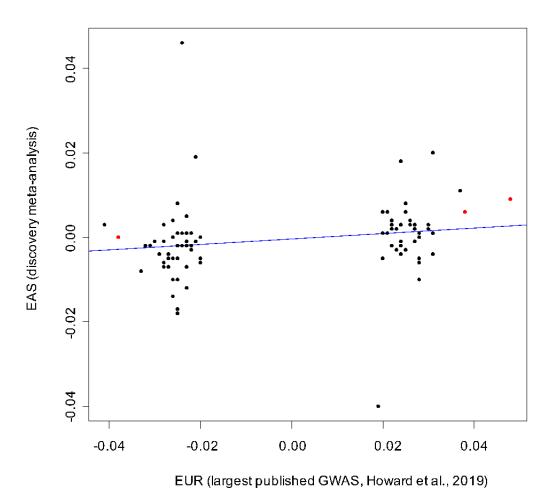
The inflation factor war  $\lambda$  = 1.383,  $\lambda$   $_{1000}$  = 1.001.

# eFigure 5. Forest Plots for the Two Previously Reported Depression Loci Based on the Chinese CONVERGE Study



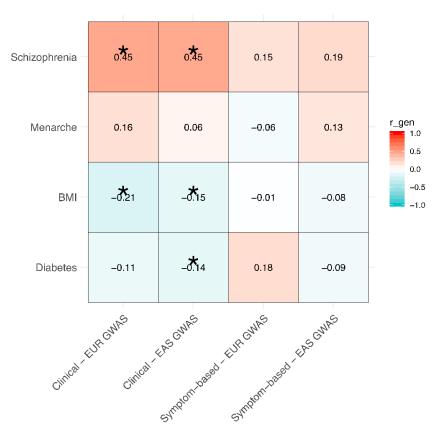
The plot shows the effect size estimates and associated confidence interval for each of the studies. IHS=Intern Health Study; CKB=China Kadoorie Biobank (symptom-based depression outcome).

eFigure 6. Effect Estimates for Depression of Previously Reported Depression Loci in the Discovery European Study vs in the East Asian Meta-Analysis



The effects are presented in log odds ratios. Variants with more than 80% power to replicate in the EAS analysis are coloured in red. The slope for regression between effect sizes is 0.065. EAS=East-Asian ancestry samples (current study), EUR=European-ancestry samples<sup>17</sup>.

**eFigure 7.** Genetic Correlations Between the Clinical and Symptom-Based Depression Phenotypes in East Asians and Other Traits in Europeans



For this analysis we used published summary statistics for schizophrenia, age of menarche, body mass index (BMI) and type 2 diabetes, from European (EUR) GWAS (LDSC) and East Asian (EAS) GWASs (POPCORN). Colours correspond to direction and strength of the genetic correlations ( $r_{gen}$ ). Statistically significant genetic correlations are indicated by a star (\*).

eTable 2. Details of the Genotyping for Each Dataset Included in the Discovery East Asian Meta-Analysis for Depression

Study	Genotyping Array	Imputation panel	Inflation factor (λ)	N cases	N controls	N markers (included in the meta- analysis)
СКВ	Custom-designed Affymetrix	1000Genomes	1.000	5376	69998	10,834,708
CONVERGE	Low-depth Whole Genome Sequencing	1000Genomes Phase 1 Asian panel	1.075	5303	5337	5,987,610
23andMe	Illumina HumanHap550+ BeadChip, Illumina OmniExpress+ BeadChip, a custom-designed array and Illumina Infinium Global Screening Array	1000 Genomes Phase 3 haplotypes with the UK10 imputation reference panel	1.024	2729	90310	9,072,919
Taiwan MDD study - Platform 1	Affymetrix CHB Array, Affymetrix TWB1.0 Array, Illumina Human Omni Express Exiome Beadchip*	1000Genomes Phase 3	0.945	988	6075	551,251
Taiwan MDD study - Platform 2	Affymetrix TWB2.0 Array	1000Genomes Phase 3	1.013	360	2317	4,390,026
IHS	CoreExome	Haplotype Reference Consortium panel	1.023	294	544	4,626,568
WHI	CardioMetabochip	-	1.045	454	2553	94,527
UKB	UKBB Axiom & BiLEVE	1000Genomes Phase 3 + Haplotype Reference Consortium	1.039	133	366	8,037,956
Army STARRS	Illumina OmniExpress + Exome array	1000Genomes	1.06	74	442	6,591,199
Bio <i>Me</i>	Infinium Global Screening Array-24 v2.0	1000Genomes Phase 3	0.995	60	835	6,336,224
Meta-analysis	-	-		15,771	178,777	

\*Due to the differences in genotyping arrays, imputation and meta-analysis was performed separately. Samples genotyped with Affymetrix TWB2.0 array were considered a separate dataset, while the other samples were combined in a different set. CKB=China Kadoorie Biobank; MDD=Major Depressive Disorder; IHS=Intern Health Study; WHI=Women's Health Initiative; UKB=UK Biobank

**eTable 7.** The Two Genome-Wide Significant Depression Loci in CONVERGE and the Relevant Results in the Other East Asian Ancestry Datasets of the Current Study and the Two Largest European Studies

				rs124158	300			
Study	EA	OA	EAF	BETA	SE	Р	Ncases/ Ncontrols	Power
CONVERGE	А	G	0.452	0.152	0.028	0.0000001923	5303/5337	0.127
CKB-Symptom based	А	G	0.431	-0.006	0.020	0.77	5376/69998	1.000
CKB-Lifetime diagnosis	А	G	0.431	-0.024	0.041	0.55	1305/69998	0.942
23andMe	A	G	0.417	-0.042	0.029	0.139	2729/90310	0.999
Taiwan MDD Study - Platform 1	NA	NA	NA	NA	NA	NA	988/6075	NA
Taiwan MDD Study - Platform 1	NA	NA	NA	NA	NA	NA	360/2317	NA
WHI	NA	NA	NA	NA	NA	NA	454/2553	NA
IHS	А	G	0.428	-0.0001	0.107	0.999	294/544	0.292
UK Biobank	A	G	0.390	-0.009	0.149	0.952	133/366	0.179
Army STARRS	A	G	0.291	-0.315	0.230	0.170	74/442	0.119
BioMe	A	G	0.383	-0.239	0.212	0.261	60/835	0.115
PGC Major Depression Study (Wray et al., 2018)*	A	G	0.027	-0.004	0.039	0.797	59851/113154	1.000

				-				
Depression (Howard et al., 2019)*	A	G	0.016	-0.004	0.019	0.843	179756/329443	1.000
				rs35936	514		- <b>·</b>	
Study	EA	ΟΑ	EAF	BETA	SE	Р	Ncases/Ncontrols	Power
CONVERGE	Т	С	0.261	-0.177	0.032	0.000000127	5303/5337	0.142
CKB-Symptom based	Т	С	0.263	0.029	0.023	0.21	5376/69998	1.000
CKB-Lifetime diagnosis	Т	С	0.263	0.063	0.046	0.17	1305/69998	0.972
23andMe	Т	С	0.284	-0.003	0.031	0.929	2729/90310	1.000
Taiwan MDD Study - Platform 1	NA	NA	NA	NA	NA	NA	988/6075	NA
Taiwan MDD Study - Platform 1	Т	С	0.240	-0.126	0.091	0.1649	360/2317	0.495
WHI	NA	NA	NA	NA	NA	NA	454/2553	NA
IHS	Т	С	0.256	0.147	0.122	0.228	294/544	0.334
UK Biobank	Т	С	0.236	-0.102	0.190	0.593	133/366	0.199
Army STARRS	Т	С	0.260	0.167	0.226	0.461	74/442	0.148
BioMe	Т	с	0.264	-0.113	0.226	0.619	60/835	0.132
PGC Major Depression Study (Wray et al., 2018)*	т	С	0.057	-0.009	0.019	0.293	59851/113154	1.000
Depression (Howard et al., 2019)*	Т	С	0.048	-0.010	0.011	0.356	179756/329443	1.000

The effect sizes (beta coefficients) are reported for the effect allele. The power calculations are based on the natural log of the combined Odds Ratios in the discovery study (Cai et al., 2015), the EAF of each variant in each individual study, as well as the sample size of each study. The \* denotes the studies conducted in studies with European ancestry samples. EA=Effect Allele; OA=Other Allele; EAF=EA frequency; SE=Standard Error; CKB=China Kadoorie Biobank; MDD=Major Depressive Disorder; WHI=Women's Health Initiative; IHS=Intern Health Study; PGC=Psychiatric Genetics Consortium

eTable 9. Reproducibility of Established Depression Loci From Howard et al., 2019 in Independent
Samples of European Ancestry and in the East Asian Depression GWAS

Cohort Name	Ancestry	Phenotype definition	N cases	N controls	N variants	Observed (%)	Expected (%)	Observed /expected
BioMe	EUR	EHR	1,456	8,304	102	6.86%	9.28%	0.74
BioVU	EUR	HER	7,757	24,723	71	18.31%	28.17%	0.65
FinnGen	EUR	EHR	17,794	156,611	92	21.74%	55%	0.40
23andMe	EUR	self-reported	105,114	1,757,384	96	84.38%	99.79%	0.86
EAS GWAS	EAS	broad	15,771	178,777	94	10.6%	42.5%	0.25

\*N variants: number of lead variants from genome-wide significant loci in Howard et al which were present in the look up study

EUR: European ancestry samples

EAS: East Asian ancestry samples

EHR: Medical diagnosis of major depressive disorder from Electronic Healthcare Records

**eTable 10.** SNP-Heritabilities for the Different Depression-Definition Outcomes Considered in This Study

Study	Observed h <sup>2</sup>	Liabi	ility scale h <sup>2</sup> (SE	E)
	(SE)	K=6.5%	K=12%	K=15%
Broad depression, EAS meta-analysis	0.009 (0.002)	2.9% (0.01)	3.5% (0.01)	3.8% (0.01)
Clinical depression, EAS meta-analysis	0.024 (0.006)	6.7% (0.02)	8.2% (0.02)	8.8% (0.02)
Symtom-based depression, EAS meta- analysis	0.012 (0.006)	3.8% (0.02)	4.6% (0.03)	4.6% (0.02)
CONVERGE	0.284 (0.032)	26.2% (0.03)	31.7% (0.04)	34.1% (0.04)
China Kadoorie Biobank (symptom-based definition)	0.045 (0.017)	6.4% (0.02)	7.8% (0.03)	8.4% (0.03)
Clinical depression, EUR meta-analysis (PGC)	0.073 (0.005)	7.4% (0.01)	9% (0.01)	9.7% (0.01)
Symptom-based depression, UK Biobank European dataset (PHQ9)	0.028 (0.004)	12.2% (0.02)	14.8% (0.02)	15.9% (0.02)

EAS=East Asian ancestry; SE=Standard error

**eTable 11.** Transancestry Genetic Correlation Estimates for Diverse Phenotypes Between Samples With East Asian and European Ancestry

Trait	PMID	N EAS (cases) a	N EUR (cases)	Country b	Genetic correlati on	Standar d error	<i>P</i> value c
Schizophrenia	31740837	58,140 (22,778)	82,315 (35,476)	Multiple	0.98	0.03	>0.05
Schizophrenia	30285260	9,348 (1,940)	77,096 (33,640)	Japan	0.577	-	1.83*10-13
Bipolar disorder	30285260	64,851 (2,964)	16,731 (7,481)	Japan	0.718	-	3.65*10-3
Smoking initiation	31089300	165,436 (83,810)	359,751(297, 127)	Japan	0.717	0.035	2.2*10-16
HDL cholesterol	31551420	162,255	188,577	Japan	0.999	0.081	
HDL cholesterol	31551420	21,295	188,577	China	0.999	-	
LDL cholesterol	31551420	162,255	188,577	Japan	0.959	0.138	
LDL cholesterol	31551420	21,295	188,577	China	0.778	0.300	
Triglyceride levels	31551420	162,255	188,577	Japan	0.961	0.066	
Triglyceride levels	31551420	21,295	188,577	China	0.999	-	
Coronary artery disease	32514122 (EAS), 28714975 (EUR)	212,453 (29,319)	332,477 (71,602)	Japan	0.908	0.083	0.27
Breast cancer	32514122 (EAS), 29059683 (EUR)	95,283 (5,552)	119,014 (69,980)	Japan	0.761	0.196	0.22
Age at menarche	29773799 (EAS), 28436984 (EUR)	67,029	252,000	Japan	0.0801	0.0688	0.0036

a. Number of East Asians (EAS) in calculation with number of Europeans (EUR) in brackets; b. Country where the East Asian samples were collected; c. P value for whether the genetic correlation is different from 1.

**eTable 12.** Transancestry Genetic Correlations of Clinical and Symptom-Based Depression in East Asian Datasets With Other Traits, Based on European Studies

Trait	PMID	Genetic correlation	Standard error	Confidence Intervals
		C	Clinical depre	ssion
Body mass index (BMI)*	30124842	-0.212	0.084	-0.378, -0.047
Coronary artery disease (CAD)	28714975	-0.253	0.160	-0.567, 0.06
Age of menarche	28436984	0.161	0.099	-0.033, 0.356
Smoking (ever vs never)	30643251	-0.156	0.089	-0.331, 0.019
Subjective well-being	27089181	-0.393	0.198	-0.781, -0.004
Type 2 diabetes (T2D)	30054458	-0.113	0.113	-0.334, 0.108
Alcohol dependence (AD)	30482948	-0.045	0.298	-0.629, 0.54
Alcohol consumption (drinks per week)	30643251	-0.022	0.110	-0.237, 0.194
Attention-Deficit/Hyperactivity Disorder (ADHD)	30478444	-0.063	0.150	-0.356, 0.231
Alzheimer's disease	24418058	NA	NA	NA
Anorexia nervosa*	31308545	0.502	0.158	0.193, 0.811
Anxiety	26754954	NA	NA	NA
Autism	30804558	0.130	0.171	-0.205, 0.465
Bipolar disorder*	31043756	0.710	0.153	0.41, 1.009
Neuroticism	27089181	0.303	0.150	0.009, 0.596
Schizophrenia*	31740837	0.449	0.109	0.234, 0.664
Depressive symptoms	27089181	0.311	0.212	-0.103, 0.726
Symptom-based depression (UKB)	30305743	0.223	0.181	-0.131, 0.577
Clinical depression (PGC)*	29700475	0.413	0.159	0.101, 0.725

		Symptom-based depression				
Body mass index (BMI)	30124842	-0.009	0.100	-0.206, 0.187		
Coronary artery disease (CAD)	28714975	0.170	0.158	-0.14, 0.479		
Age of menarche	28436984	-0.065	0.106	-0.273, 0.144		
Smoking (ever vs never)	30643251	-0.172	0.126	-0.419, 0.075		
Alcohol dependence (AD)	30482948	NA	NA	NA		
Alcohol consumption (drinks per week)	30643251	-0.002	0.140	-0.276, 0.273		
Attention-Deficit/Hyperactivity Disorder (ADHD)	30478444	-0.115	0.148	-0.404, 0.175		
Alzheimer's disease	24418058	NA	NA	NA		
Anorexia nervosa*	31308545	0.449	0.193	0.07, 0.827		
Anxiety	26754954	NA	NA	NA		
Autism	30804558	0.182	0.219	-0.247, 0.611		
Bipolar disorder	31043756	0.072	0.161	-0.243, 0.388		
Neuroticism	27089181	0.840	0.216	0.417, 1.263		
Schizophrenia	31740837	0.153	0.142	-0.126, 0.431		
Subjective well-being*	27089181	-0.502	0.195	-0.885, -0.119		
Type 2 diabetes (T2D)	30054458	0.177	0.166	-0.148, 0.503		
Depressive symptoms	27089181	NA	NA	NA		
Symptom-based depression (UKB)	30305743	0.433	0.281	-0.118, 0.985		
Clinical depression (PGC)	29700475	0.558	0.221	0.124, 0.992		

The \* denotes the significance, based on the confidence intervals. The traits that did not provide robust results (Standard Error > 0.3) are not presented (Not Available (NA)).

**eTable 13.** Genetic Correlations of Clinical and Symptom-Based Depression in European Datasets With Other Traits

Trait	PMID	rg	SE	z	P-value
		Clinical de		- Psychiat sortium	ric Genetics
Symptom-based depression	30305743	0.814	0.080	10.168	2.77E-24
Attention-Deficit/Hyperactivity Disorder (ADHD)	30478444	0.570	0.040	14.139	2.19E-45
Alcohol dependence (AD)	30482948	0.583	0.119	4.915	8.89E-07
Alzheimer's disease	24418058	0.041	0.079	0.515	6.07E-01
Anorexia nervosa	31308545	0.305	0.047	6.473	9.60E-11
Anxiety	26754954	0.855	0.168	5.094	3.51E-07
Autism	30804558	0.417	0.047	8.918	4.76E-19
Bipolar disorder	31043756	0.345	0.038	9.129	6.95E-20
Alcohol consumption (drinks per week)	30643251	0.090	0.036	2.511	1.20E-02
Depressive symptoms	27089181	0.964	0.043	22.342	1.45E-110
Neuroticism	27089181	0.720	0.046	15.712	1.25E-55
Schizophrenia	31740837	0.349	0.030	11.772	5.44E-32
Age at menarche	28436984	-0.091	0.031	-2.902	3.70E-03
Body Mass Index (BMI)	30124842	0.111	0.025	4.368	1.26E-05
Smoking (ever vs never)	30643251	0.321	0.032	10.156	3.10E-24
Subjective wellbeing	27089181	-0.697	0.053	-13.092	3.67E-39
Type 2 diabetes (T2D)	30054458	0.185	0.031	5.926	3.11E-09
Coronary Artery Disease (CAD)	28714975	0.203	0.037	5.463	4.68E-08

Trait	PMID	rg	SE	z	P-value
		Clinical depression - Psychiatric Gene Consortium			
Broad depression (self-reported help- seeking behaviour for mental health difficulties or diagnosis of a depressive mood disorder from linked hospital admission records)	29662059	0.878	0.038	23.160	1.17E-118
ICD-coded MDD (hospital admission diagnosis)	29662059	0.907	0.070	13.021	9.26E-39
Probable MDD (cardinal symptoms + broad depression)	29662059	0.840	0.085	9.925	3.26E-23
Depression	30718901	0.946	0.022	43.498	0
		Symptom	based de	pression -	UK Biobank
Clinical depression	29700475	0.814	0.080	10.168	2.77E-24
Attention-Deficit/Hyperactivity Disorder (ADHD)	30478444	0.520	0.070	7.388	1.49E-13
Alcohol dependence (AD)	30482948	0.375	0.140	2.682	7.31E-03
Alzheimer's disease	24418058	-0.065	0.108	-0.601	5.48E-01
Anorexia nervosa	31308545	0.032	0.073	0.441	6.59E-01
Anxiety	26754954	0.596	0.211	2.826	4.72E-03
Autism	30804558	0.315	0.097	3.263	1.10E-03
Bipolar disorder	31043756	0.118	0.055	2.155	3.12E-02
Alcohol consumption (drinks per week)	30643251	-0.063	0.053	-1.202	2.29E-01
Depressive symptoms	27089181	0.894	0.091	9.873	5.47E-23
Neuroticism	27089181	0.608	0.095	6.427	1.30E-10

Trait	PMID	rg	SE	z	P-value
		Symptom-based depression - UK Biobank			
Schizophrenia	31740837	0.218	0.049	4.481	7.44E-06
Age at menarche	28436984	-0.051	0.039	-1.314	1.89E-01
Body Mass Index (BMI)	30124842	0.314	0.041	7.700	1.36E-14
Smoking (ever vs never)	30643251	0.290	0.044	6.683	2.34E-11
Subjective wellbeing	27089181	-0.750	0.086	-8.722	2.73E-18
Type 2 diabetes (T2D)	30054458	0.353	0.063	5.603	2.11E-08
Coronary Artery Disease (CAD)	28714975	0.310	0.057	5.464	4.67E-08
Broad depression (self-reported help- seeking behaviour for mental health difficulties or diagnosis of a depressive mood disorder from linked hospital admission records)	29662059	0.681	0.061	11.254	2.22E-29
ICD-coded MDD (hospital admission diagnosis)	29662059	0.817	0.109	7.521	5.44E-14
Probable MDD (cardinal symptoms + broad depression)	29662059	0.724	0.103	7.019	2.23E-12
Depression	30718901	0.708	0.059	11.925	0

rg= genetic correlation; SE= standard error

**eTable 14.** Genetic Correlations of Clinical and Symptom-Based Depression in East Asian Datasets With Other Traits, Based on East Asian Studies

Trait	PMID	rg	SE	z	P-value		
		Clinical depression					
Schizophrenia	31740837	0.447	0.085	5.256	1.47E-07		
Type 2 diabetes (T2D)	30718926	-0.143	0.072	-1.997	0.046		
Body Mass Index (BMI)	28892062	-0.147	0.061	-2.402	0.016		
Age at menarche	29773799	0.060	0.087	0.687	0.492		
High-density lipoprotein (HDL)	28334899	0.093	0.154	0.605	0.545		
Low-density lipoprotein (LDL)	28334899	0.177	0.134	1.323	0.186		
Triglycerides (TG)	28334899	-0.073	0.165	-0.441	0.660		
Total cholesterol (TC)	28334899	0.127	0.116	1.097	0.273		
		Symptom-based depression					
Schizophrenia	31740837	0.189	0.137	1.380	0.168		
Type 2 diabetes (T2D)	30718926	-0.088	0.120	-0.734	0.463		
Body Mass Index (BMI)	28892062	-0.082	0.098	-0.832	0.405		
Age at menarche	29773799	0.130	0.134	0.971	0.332		
High-density lipoprotein (HDL)	28334899	0.145	0.219	0.660	0.509		
Low-density lipoprotein (LDL)	28334899	0.133	0.226	0.587	0.557		
Triglycerides (TG)	28334899	-0.321	0.235	-1.368	0.172		
Total cholesterol (TC)	28334899	0.085	0.208	0.411	0.681		

rg= genetic correlation; SE= standard error

# eReferences

1. Chen Z, Chen J, Collins R, et al. China Kadoorie Biobank of 0.5 million people: survey methods, baseline characteristics and long-term follow-up. *Int J Epidemiol*. Dec 2011;40(6):1652-66. doi:10.1093/ije/dyr120

2. Wojcik GL, Graff M, Nishimura KK, et al. Genetic analyses of diverse populations improves discovery for complex traits. *Nature*. 06 2019;570(7762):514-518. doi:10.1038/s41586-019-1310-4

3. CONVERGE Consortium. Sparse whole-genome sequencing identifies two loci for major depressive disorder. *Nature*. Jul 2015;523(7562):588-91. doi:10.1038/nature14659

4. Chen CH, Yang JH, Chiang CWK, et al. Population structure of Han Chinese in the modern Taiwanese population based on 10,000 participants in the Taiwan Biobank project. *Hum Mol Genet*. 12 2016;25(24):5321-5331. doi:10.1093/hmg/ddw346

5. WHI Study Group. Design of the Women's Health Initiative clinical trial and observational study. The Women's Health Initiative Study Group. *Control Clin Trials*. Feb 1998;19(1):61-109. doi:10.1016/s0197-2456(97)00078-0

6. Wassertheil-Smoller S, Shumaker S, Ockene J, et al. Depression and cardiovascular sequelae in postmenopausal women. The Women's Health Initiative (WHI). *Arch Intern Med*. Feb 2004;164(3):289-98. doi:10.1001/archinte.164.3.289

7. Fang Y, Scott L, Song P, Burmeister M, Sen S. Genomic prediction of depression risk and resilience under stress. *Nat Hum Behav.* Jan 2020;4(1):111-118. doi:10.1038/s41562-019-0759-3

8. Levis B, Benedetti A, Thombs BD, Collaboration DSDD. Accuracy of Patient Health Questionnaire-9 (PHQ-9) for screening to detect major depression: individual participant data meta-analysis. *BMJ*. 04 2019;365:11476. doi:10.1136/bmj.11476

9. Lam M, Awasthi S, Watson HJ, et al. RICOPILI: Rapid Imputation for COnsortias PIpeLIne.

Bioinformatics. Feb 2020;36(3):930-933. doi:10.1093/bioinformatics/btz633

10. Bycroft C, Freeman C, Petkova D, et al. The UK Biobank resource with deep phenotyping and genomic data. *Nature*. 10 2018;562(7726):203-209. doi:10.1038/s41586-018-0579-z

11. Conomos MP, Miller MB, Thornton TA. Robust inference of population structure for ancestry prediction and correction of stratification in the presence of relatedness. *Genet Epidemiol*. May 2015;39(4):276-93. doi:10.1002/gepi.21896

12. Ursano RJ, Colpe LJ, Heeringa SG, et al. The Army study to assess risk and resilience in servicemembers (Army STARRS). *Psychiatry*. 2014;77(2):107-19. doi:10.1521/psyc.2014.77.2.107

13. Kessler RC, Colpe LJ, Fullerton CS, et al. Design of the Army Study to Assess Risk and Resilience in Servicemembers (Army STARRS). *Int J Methods Psychiatr Res.* Dec 2013;22(4):267-75. doi:10.1002/mpr.1401

14. Stein MB, Ware EB, Mitchell C, et al. Genomewide association studies of suicide attempts in US soldiers. *Am J Med Genet B Neuropsychiatr Genet*. Dec 2017;174(8):786-797. doi:10.1002/ajmg.b.32594

15. Belbin GM, Odgis J, Sorokin EP, et al. Genetic identification of a common collagen disease in puerto ricans via identity-by-descent mapping in a health system. *Elife*. 09 2017;6doi:10.7554/eLife.25060

16. Tung JY, Do CB, Hinds DA, et al. Efficient replication of over 180 genetic associations with self-reported medical data. *PLoS One*. 2011;6(8):e23473. doi:10.1371/journal.pone.0023473

17. Howard DM, Adams MJ, Clarke TK, et al. Genome-wide meta-analysis of depression identifies 102 independent variants and highlights the importance of the prefrontal brain regions. *Nat Neurosci*. 03 2019;22(3):343-352. doi:10.1038/s41593-018-0326-7

18. Zhu Z, Zhang F, Hu H, et al. Integration of summary data from GWAS and eQTL studies predicts complex trait gene targets. *Nat Genet*. 05 2016;48(5):481-7. doi:10.1038/ng.3538

19. Watanabe K, Taskesen E, van Bochoven A, Posthuma D. Functional mapping and annotation of genetic associations with FUMA. *Nat Commun.* 11 2017;8(1):1826. doi:10.1038/s41467-017-01261-5

20. de Leeuw CA, Mooij JM, Heskes T, Posthuma D. MAGMA: generalized gene-set analysis of GWAS data. *PLoS Comput Biol.* Apr 2015;11(4):e1004219. doi:10.1371/journal.pcbi.1004219

21. Ward LD, Kellis M. HaploReg: a resource for exploring chromatin states, conservation, and regulatory motif alterations within sets of genetically linked variants. *Nucleic Acids Res.* Jan 2012;40(Database issue):D930-4. doi:10.1093/nar/gkr917

22. Carvalho-Silva D, Pierleoni A, Pignatelli M, et al. Open Targets Platform: new developments and updates two years on. *Nucleic Acids Res.* 01 2019;47(D1):D1056-D1065. doi:10.1093/nar/gky1133

23. Staley JR, Blackshaw J, Kamat MA, et al. PhenoScanner: a database of human genotype-phenotype associations. *Bioinformatics*. 10 2016;32(20):3207-3209. doi:10.1093/bioinformatics/btw373

 MacArthur J, Bowler E, Cerezo M, et al. The new NHGRI-EBI Catalog of published genome-wide association studies (GWAS Catalog). *Nucleic Acids Res.* 01 2017;45(D1):D896-D901. doi:10.1093/nar/gkw1133
 Sham PC, Purcell SM. Statistical power and significance testing in large-scale genetic studies. *Nat Rev*

*Genet*. May 2014;15(5):335-46. doi:10.1038/nrg3706
26. Tabassum R, Rämö JT, Ripatti P, et al. Genetic architecture of human plasma lipidome and its link to cardiovascular disease. *Nat Commun.* 09 2019;10(1):4329. doi:10.1038/s41467-019-11954-8

27. Bulik-Sullivan BK, Loh PR, Finucane HK, et al. LD Score regression distinguishes confounding from polygenicity in genome-wide association studies. *Nat Genet*. Mar 2015;47(3):291-5. doi:10.1038/ng.3211

28. Yang J, Lee SH, Goddard ME, Visscher PM. GCTA: a tool for genome-wide complex trait analysis. *Am J Hum Genet*. Jan 2011;88(1):76-82. doi:10.1016/j.ajhg.2010.11.011

29. Bromet E, Andrade LH, Hwang I, et al. Cross-national epidemiology of DSM-IV major depressive episode. *BMC Med.* Jul 2011;9:90. doi:10.1186/1741-7015-9-90

30. Wray NR, Ripke S, Mattheisen M, et al. Genome-wide association analyses identify 44 risk variants and refine the genetic architecture of major depression. *Nat Genet*. 05 2018;50(5):668-681. doi:10.1038/s41588-018-0090-3

31. Manea L, Gilbody S, McMillan D. Optimal cut-off score for diagnosing depression with the Patient Health Questionnaire (PHQ-9): a meta-analysis. *CMAJ*. Feb 2012;184(3):E191-6. doi:10.1503/cmaj.110829

32. Davis KAS, Coleman JRI, Adams M, et al. Mental health in UK Biobank - development, implementation and results from an online questionnaire completed by 157 366 participants: a reanalysis. *BJPsych Open*. Feb 2020;6(2):e18. doi:10.1192/bjo.2019.100

33. Brown BC, Ye CJ, Price AL, Zaitlen N, Consortium AGENTD. Transethnic Genetic-Correlation Estimates from Summary Statistics. *Am J Hum Genet*. 07 2016;99(1):76-88. doi:10.1016/j.ajhg.2016.05.001

34. Lam M, Chen CY, Li Z, et al. Comparative genetic architectures of schizophrenia in East Asian and European populations. *Nat Genet.* 12 2019;51(12):1670-1678. doi:10.1038/s41588-019-0512-x

35. Ikeda M, Takahashi A, Kamatani Y, et al. Genome-Wide Association Study Detected Novel Susceptibility Genes for Schizophrenia and Shared Trans-Populations/Diseases Genetic Effect. *Schizophr Bull*. 06 2019;45(4):824-834. doi:10.1093/schbul/sby140

36. Matoba N, Akiyama M, Ishigaki K, et al. GWAS of smoking behaviour in 165,436 Japanese people reveals seven new loci and shared genetic architecture. *Nat Hum Behav*. 05 2019;3(5):471-477. doi:10.1038/s41562-019-0557-y

37. Kuchenbaecker K, Telkar N, Reiker T, et al. The transferability of lipid loci across African, Asian and European cohorts. *Nat Commun.* 09 2019;10(1):4330. doi:10.1038/s41467-019-12026-7

38. Horikoshi M, Day FR, Akiyama M, et al. Elucidating the genetic architecture of reproductive ageing in the Japanese population. *Nat Commun.* 05 2018;9(1):1977. doi:10.1038/s41467-018-04398-z

39. Ishigaki K, Akiyama M, Kanai M, et al. Large-scale genome-wide association study in a Japanese population identifies novel susceptibility loci across different diseases. *Nat Genet.* 07 2020;52(7):669-679. doi:10.1038/s41588-020-0640-3

40. Nelson CP, Goel A, Butterworth AS, et al. Association analyses based on false discovery rate implicate new loci for coronary artery disease. *Nat Genet*. Sep 2017;49(9):1385-1391. doi:10.1038/ng.3913

41. Michailidou K, Lindström S, Dennis J, et al. Association analysis identifies 65 new breast cancer risk loci. *Nature*. 11 2017;551(7678):92-94. doi:10.1038/nature24284

42. Day FR, Thompson DJ, Helgason H, et al. Genomic analyses identify hundreds of variants associated with age at menarche and support a role for puberty timing in cancer risk. *Nat Genet*. Jun 2017;49(6):834-841. doi:10.1038/ng.3841

43. Ramasamy A, Trabzuni D, Guelfi S, et al. Genetic variability in the regulation of gene expression in ten regions of the human brain. *Nat Neurosci*. Oct 2014;17(10):1418-1428. doi:10.1038/nn.3801

44. Hong S, Chung S, Leung K, Hwang I, Moon J, Kim KS. Functional roles of Nurr1, Pitx3, and Lmx1a in neurogenesis and phenotype specification of dopamine neurons during in vitro differentiation of embryonic stem cells. *Stem Cells Dev.* Mar 2014;23(5):477-87. doi:10.1089/scd.2013.0406

45. Bennett DA, Schneider JA, Arvanitakis Z, Wilson RS. Overview and findings from the religious orders study. *Curr Alzheimer Res.* Jul 2012;9(6):628-45. doi:10.2174/156720512801322573

46. Pérez-González A, Pazo A, Navajas R, Ciordia S, Rodriguez-Frandsen A, Nieto A. hCLE/C14orf166 associates with DDX1-HSPC117-FAM98B in a novel transcription-dependent shuttling RNA-transporting complex. *PLoS One*. 2014;9(3):e90957. doi:10.1371/journal.pone.0090957

47. Fink JM, Hirsch BA, Zheng C, Dietz G, Hatten ME, Ross ME. Astrotactin (ASTN), a gene for glial-guided neuronal migration, maps to human chromosome 1q25.2. *Genomics*. Feb 1997;40(1):202-5. doi:10.1006/geno.1996.4538

48. drweinberger@libd.org BAHBGCEa, Consortium BAHBG. BrainSeq: Neurogenomics to Drive Novel Target Discovery for Neuropsychiatric Disorders. *Neuron*. Dec 2015;88(6):1078-1083. doi:10.1016/j.neuron.2015.10.047

49. Accogli A, Calabretta S, St-Onge J, et al. De Novo Pathogenic Variants in N-cadherin Cause a Syndromic Neurodevelopmental Disorder with Corpus Collosum, Axon, Cardiac, Ocular, and Genital Defects. *Am J Hum Genet*. 10 2019;105(4):854-868. doi:10.1016/j.ajhg.2019.09.005

50. Lewis CM, Ng MY, Butler AW, et al. Genome-wide association study of major recurrent depression in the U.K. population. *Am J Psychiatry*. Aug 2010;167(8):949-57. doi:10.1176/appi.ajp.2010.09091380