Supplementary Online Content

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

eMethods. Supplemental Methods

GWAS Data Sources

CRP Levels

We used GWAS summary statistics by the CHARGE inflammation working group. This study analysed CRP level data from 88 studies comprising 204,402 individuals from European ancestry. While included studies used standard laboratory assessments for serum CRP (measured in mg/L), exact methodology varied across studies and we refer to the supplementary material by Lighart *et al.* for details. Importantly, individuals with autoimmune conditions and taking immunotherapy were excluded from analyses, as were individuals with CRP levels deviating from study-specific mean by more than four standard deviations. GWAS estimates were corrected for age, sex, population substructure and relatedness. Results revealed 48 genome-wide significant, independent loci in the HapMap analyses.

Depressive symptoms

We used UK Biobank GWAS summary statistics for depressive symptoms as assessed in an online follow-up survey by the self-report Patient Health Questionnaire (PHQ)-9. ^{2,3} The PHQ-9 does not reflect the whole depressive symptom space, ⁴ but it was specifically developed to reflect depressive symptoms as defined in the Diagnostic and Statistical Manual for Mental Disorders (DSM)-IV. To reflect DSM-IV minimum duration for a diagnosis of MD, instructions for the PHQ-9 asked for symptoms occurring in the previous two weeks; see eTable 1 for symptom descriptions. Responses to PHQ-9 items were assessed on a Likert scale from 1 (not at all) to 4 (nearly every day) with the option to indicate "Prefer not to answer". Frequency statistics for each PHQ-9 symptom on this Likert scale in the UK Biobank sample are highlighted in eTable 2. Importantly, the PHQ-9 does not differentiate symptoms underlying so-called composite symptoms; that is, changes in appetite, psychomotor changes and sleep problems. As a © 2020 Kappelmann N et al. *JAMA Psychiatry*.

consequence, analyses using composite symptoms (as is the case in present report) may not be able to identify associations specific to only one of the symptoms underlying a composite symptom.

The Neale lab conducted GWAS of individual PHQ-9 symptoms as part of an extensive effort to run GWAS on thousands of phenotypes (http://www.nealelab.is/uk-biobank). Analyses were automated using the PHESANT tool⁵, which chooses the appropriate analysis approach based on variable characteristics (here: ordinal logistic regression). GWAS were corrected for age, age², sex, age*sex, age*sex, and first 20 principal components of genotype data.

eTable 1. PHQ-9 Depressive Symptoms as assessed in the UK Biobank

No	ID	Label	Description Description	Question	Sample Size
1	20514	Anhedonia	Recent lack of interest or pleasure in doing things	Little interest or pleasure in doing things?	117,757
2	20510	Depressed mood	Recent feelings of depression	Feeling down, depressed, or hopeless?	117,656
3	20517	Sleep problems	Trouble falling or staying asleep, or sleeping too much	Trouble falling or staying asleep, or sleeping too much?	117,822
4	20519	Tiredness	Recent feelings of tiredness or low energy	Feeling tired or having little energy?	117,828
5	20511	Changes in appetite	Recent poor appetite or overeating	Poor appetite or overeating?	117,907
6	20507	Feelings of inadequacy	Recent feelings of inadequacy	Feeling bad about yourself — or that you are a failure or have let yourself or your family down?	117,502
7	20508	Concentration problems	Recent trouble concentrating on things	Trouble concentrating on things, such as reading the newspaper or watching television?	117,899
8	20518	Psychomotor changes	Recent changes in speed/amount of moving or speaking	Moving or speaking so slowly that other people could have noticed? Or so fidgety or restless that you have been moving a lot more than usual?	117,868
9	20513	Suicidality	Recent thoughts of suicide or self-harm	Thoughts that you would be better off dead, or thoughts of hurting yourself in some way?	117,177

eTable 2. Likert Scale Frequency Statistcs of PHQ-9 Depressive Symptoms

					Likert ratings		
No	ID	Label	Prefer not	Not at all	Several	More than	Nearly
			to say		days	half the	every day
						days	
1	20514	Anhedonia	436	126877	23758	3622	2656
2	20510	Depressed	573	121412	29814	3284	2266
		mood					
3	20517	Sleep	340	79755	53387	11193	12674
		problems					
4	20519	Tiredness	338	77831	61486	8803	8891
5	20511	Changes in	231	127797	20825	4490	4006
		appetite					
6	20507	Feelings of	779	125611	24108	3492	3359
		inadequacy					
7	20508	Concentration	239	128224	22872	3323	2691
		problems					
8	20518	Psychomotor	280	148037	6750	1288	994
		changes					
9	20513	Suicidality	1225	149360	5484	719	561

Note: Frequency statistics for Likert ratings were retrieved from UK Biobank website (https://biobank.ctsu.ox.ac.uk/crystal/label.cgi?id=138) on 14th February, 2020.

PGC MD

GWAS summary statistics for MD were retrieved from two original reports (Howard *et al.*⁶ & Wray *et al.*⁷) to avoid sample overlap in LDSC regression and MR analyses. For the present investigation, we did not include data on participants from 23andMe.

Howard *et al.*⁶ meta-analysed three prior investigations (including Wray *et al.* data).^{7–9} A total of 807,553 individuals were included in the original report by Howard *et al.* and 102 genome-wide significant, independent variants for MD identified. In the present report, we used GWAS summary data from 500,199 individuals, which excludes individuals from 23andMe. The original study by Wray *et al.* reports data from 480,359 individuals, which included individuals from a first wave of the UK Biobank. In the present report, we used a subset of these data (as provided by the PGC), which excludes 23andMe and UK Biobank participants. The remaining sample size

from Wray *et al.* was varying by SNP and included up to 230,214 individuals (minimum=55,795, median=142,646, maximum=230,241) with a median of 45,396 cases and 97,250 controls. Covariates used by Wray *et al.*⁷ were age, sex, and principal components as implemented in the RICOPILI pipeline. Howard *et al.*⁶ used age, sex, genotyping array, and the first eight principal components in the UK Biobank sample as covariates.

Importantly, definitions of MD from meta-analysed GWAS data differed, including a 'broad depression' definition, self-reported diagnosed depression, and meeting MD diagnostic criteria (Wray *et al.*⁷ study). Recent work has emphasised that these phenotypic definitions are relevant and, in particular, that minimal phenotyping definitions such as 'broad depression' may prohibit finding specific signatures of MD. While we acknowledge this limitation, we decided to use the term 'MD' to denote both the less specific depression phenotypes by Howard *et al.* and the diagnosis-ascertained phenotype by Wray *et al.* to make the present report more parsimonious as findings between depression phenotypes were similar.

Insomnia

GWAS summary statistics for insomnia were taken from Jansen *et al.*¹², who meta-analysed data from UK Biobank (n=386,533) and 23andMe (n=944,477), resulting in a total sample size of 1,331,010 individuals. We included insomnia to provide a comparison to the PHQ-9 composite symptom of "sleep problems". Insomnia was defined in UK Biobank whenever participants answered "usually" (rather than "never/rarely", "sometimes", or "prefer not to say") to the question "Do you have trouble falling asleep at night or do you wake up in the middle of the night?".

23andMe samples are not included in GWAS summary statistics used in the present report, so we included data from a SNP-dependent sample of up to 386,533 individuals (minimum=366,461, median=385,989, maximum=386,533). GWAS in UK Biobank was conducted using logistic regression and adjusted for age, sex, genotype array, and 10 genetic principal components.

GIANT BMI & Height

GWAS summary statistics for BMI and height were taken from Locke *et al.*¹³ for BMI and Wood *et al.*¹⁴ for height. Final sample size varied per SNP but included about 230 thousand individuals for BMI (minimum=50,005, median=233,524, maximum=322,154) and 250 thousand individuals for height (minimum=50,003, median=251,631, maximum=253,280). Data can be retrieved from the GIANT consortium under

https://portals.broadinstitute.org/collaboration/giant/index.php/GIANT_consortium_data_files.

BMI and height analyses were corrected for age, sex, and study-specific covariates such as genotype-based principal components. 97 and 423 genome-wide significant loci were identified for BMI and height, respectively.

sIL-6R plasma levels

A subset of SNPs for sIL-6R plasma levels were taken from Rosa *et al.*¹⁵ for MR analyses. These estimates are based on large-scale GWAS investigations on the human plasma proteome of 3,301 European individuals participating in the INTERVAL study, ¹⁶ 2,994 of which had data on sIL-6R plasma levels as reported in Rosa *et al.*¹⁵ GWAS was corrected for sex, age, duration between blood draw and processing as well as three ancestry principal components from multi-dimensional scaling. Genome-wide significant hits were not reported.

Mendelian Randomisation (MR) Analysis

Genetic Instruments

As described in the main manuscript, we defined two main genetic instruments for upregulated *CRP levels* and *IL-6 signalling* and alternative/additional genetic instruments for upregulated *CRP levels*, *IL-6 signalling* and *BMI*.

For all genetic instruments except the alternative IL-6 signalling instrument, genome-wide significant SNPs were clumped with a 10,000 kB window to a threshold of $R^2 < 0.1$ to ascertain independence between genetic variants. For the alternative IL-6 signalling instrument, SNPs with F-statistic greater than 15 (and not necessarily genome-wide significant) were clumped to the same threshold of $R^2 < 0.1$.

Main genetic instruments were based on a recent report by Georgakis *et al.*¹⁷ who investigated the association of *CRP levels* and *IL-6 signalling* on cardiovascular outcomes. Due to functional knowledge that IL-6 induces production of CRP from hepatocytes, ¹⁸ Georgakis *et al.*¹⁷ used GWAS summary data for upregulated CRP levels from the CRP GWAS by Lightart *et al.*¹ to define both the genetic instrument for CRP levels and for IL-6 signalling. This instrument selection strategy assessing different upstream effector molecules indexed using the same downstream readout has been extensively used in prior research. ^{19–25} Specifically, independent (R^2 <0.1), genome-wide significant SNPs within a 300kB region upstream or downstream of *CRP* and *IL-6R* genes, respectively, were selected that were associated with CRP levels. ¹

We intentionally used the term "*IL-6 signalling*" in relation to the *IL-6R* genetic instrument, because the instrument was weighted based on GWAS summary data for CRP levels, which is a downstream substrate of IL-6 activity. Despite *IL-6R* SNP effect weighting being based on CRP levels, however, we are confident about the effects reflecting IL-6 signalling as IL-6 is an

upstream inducer of CRP. When comparing genetic variants indexing increased IL-6 signalling to the Genotype-Tissue Expression (GTEx) platform²⁶, we find that 3 of 6 SNPs (i.e., rs2228145, rs73026617 & rs11264224) are IL-6R-expression quantitative trait loci (eQTLs) in immune-/vascular-relevant tissues (see eTable 3 & eFigure 1). Additionally, the strongest genetic variant (rs2228145), based on an F-statistic of 458.16, has been investigated in prior research and was shown to impair IL-6 classical signalling as the minor allele (C) reduces the expression of membrane bound IL-6R and decreases IL-6 production post-stimulation;²⁷ this aligns with the major allele (A) showing a positive, increasing effect on CRP levels. rs2228145 has also been associated with risk for severe depression and psychosis in a previous study.²⁸ Overall, these findings lend strong support for a functional role of our IL-6 signalling instrument on CRP levels *via* IL-6 signalling.

We compared these genetic instruments to genetic instruments used in a previous MR study by Khandaker *et al.*²⁹ in eTables 4-5 regarding LD and F-statistics, which shows that our genetic instruments include and extend information of these previously used instruments.

As alternative approaches, we used genetic variants throughout the genome that were associated with CRP levels and, based on a previous report, ¹⁵ variants within 250kB of the *IL6R* gene that were associated (F>15) with sIL-6R plasma levels as an indirect marker of IL-6 signalling. As sIL-6Rs are inversely associated with IL-6 signalling, we changed the effect valence of genetic variants by multiplying beta estimates by -1. We also compare main IL-6 signalling and alternative (indirect) IL-6 signalling instruments in terms of LD between included SNPs and F-statistics (eTable 6). This shows that 3 of 6 SNPs from main IL-6 signalling instrument are in strong LD with the alternative IL-6 signalling instrument; rs11264224 with rs11264224 (R²=1); rs3766924 with rs12059682 (R²=0.994) and rs4129267 with rs2228145 (R²=1). Of note, this

includes the strongest SNP of the alternative instrument (rs4129267) based on an F-statistic of 5041.904.

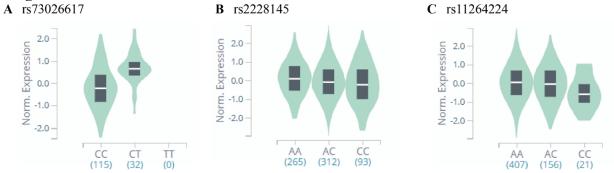
Lastly, we created a genetic instrument for BMI to compare MR effects of inflammatory activity to potential effects of metabolic dysregulation. This instrument was based on genome-wide significant variants of GWAS summary statistics by Locke et al., ¹³ which do not include UK Biobank participants assuring sample independence.

eTable 3. SNP Overview of IL-6 Signalling Instrument and IL-6R-Expression Quantitative Trait Loci (eQTL)

				CRP GWAS Estimates					IL-6R-eQTL ^a	
SNP	Position	IL-6R	Reference	Effect	MAF	Beta	SE	P	Immune-/ vascular-	P
	(hg19)	gene	allele	allele					relevant tissue	
rs73026617	154369981	No	C	T	0.097	0.0474	0.0068	3.16e ⁻¹²	Cells - EBV-transformed	2.2e ⁻⁹
									lymphocytes	
rs12083537	154381103	Yes	G	A	0.193	0.0643	0.0053	7.14e ⁻³⁴	-	-
rs4556348	154394296	Yes	С	T	0.148	0.0541	0.0067	6.77e ⁻¹⁶	-	-
rs2228145	154426970	Yes	С	A	0.360	0.0899	0.0042	1.21e ⁻¹⁰¹	Whole blood	5.8e ⁻⁹
rs11264224	154568086	No	С	A	0.193	0.0465	0.0057	3.41e ⁻¹⁶	Artery - Tibial	1.5e ⁻⁴
rs12059682	154579585	No	С	Т	0.196	-0.0441	0.0049	2.26e ⁻¹⁹	-	-

Note: aIL-6R-eQTL in immune-/ vascular-relevant tissues were identified by searching GTEx Portal (https://gtexportal.org/), accessed on 13th April, 2020.²⁶

eFigure 1. Violin Plots for IL-6R-eQTL in Immune-/ Vascular-relevant Tissues



Note: Normalised expression violin plots of IL-6R eQTL for (A) rs73026617, (B) rs2228145, and (C) rs11264224 in immune/ vascular tissue as specified in eTable 3.

eTable 4. Linkage Disequilibrium and F-statistics of IL-6R Gene SNPs between Studies

Kapp	elmann <i>et al</i> .	R ² witl	R ² with SNPs in Khandaker <i>et al.</i> ²⁹				
SNPs	F-statistics ^a	rs4845371	rs7529229	rs12740969			
rs11264224 ^b	66.551	0.014	0.078	0.117			
rs12059682	81	0.002	0.077	0.063			
rs12083537	147.187	0.006	0.010	0.039			
rs2228145 ^b	458.164	0.426	0.942	0.328			
rs4556348	65.2	0.117	0.083	0.186			
rs73026617 ^b	48.589	0.002	0.025	0.076			

Note: SNPs with R²>0.1 are highlighted in bold. Estimates were obtained using the *LDmatrix* function of the *LDlinkR* package in *R* and European ancestry reference population.^{30,31 a}F-statistics were computed using the approximation $F = \frac{beta^2}{SE^2}$.^{15,32 b}These SNPs are eQTLs for IL-6R (cf. eTable 3).

eTable 5. Linkage Disequilibrium and F-statistics of CRP Gene SNPs between Studies

CTable 3. Linkage	Discquiiibiiuii	and 1-statistics of CK1 Oche 51413 between studies						
Kappelma	nn <i>et al</i> .]	R ² with SNPs in Khandaker <i>et al.</i> ²⁹					
SNPs	F-statistics ^a	rs3093077	rs1205	rs1130864	rs1800947			
rs112433451	66.238	0.003	0.090	0.020	0.002			
rs112689575	89.727	0	0.001	0.002	0.001			
rs115321806	70.662	0.001	0.003	0.016	0.001			
rs115585839	94.718	0.002	0.01	0.046	0.001			
rs1205	1829.054	0.035	1	0.214	0.119			
rs1446975	259.057	0.055	0.061	0.121	0.007			
rs151313645	51.636	0.002	0.066	0.012	0.002			
rs17459069	92.788	0.002	0.047	0.013	0.002			
rs3093059	725.102	0.970	0.032	0.037	0.004			
rs35370436	71.014	0.002	0.012	0.069	0.001			
rs3806186	48.418	0	0.045	0.004	0.011			
rs55688443	81.574	0.002	0	0.001	0.001			
rs61821567	105.414	0.002	0.008	0.046	0.002			
rs7517317	102.235	0.001	0.009	0.018	0.011			
rs7519020	32.184	0	0.003	0.012	0			
rs7521729	35.632	0	0.002	0.009	0.002			
rs77013776	605.419	0.003	0.073	0.016	0.537			

Note: SNPs with R²>0.1 are highlighted in bold. Estimates were obtained using the *LDmatrix* function of the *LDlinkR* package in *R* and European ancestry reference population. ^aF-statistics were computed using the approximation $F = \frac{beta^2}{SE^2}$. ^{15,32}

eTable 6. Linkage Disequilibrium of SNPs in IL-6R-based Gene Instruments

SNPs for indirect	Disequinorium		SNPs for IL-6 Signalling					
IL-6 Signalling	F-statistics ^a	rs11264224	rs12059682	rs12083537	rs2228145	rs4556348	rs73026617	
rs10752605	80.184	0.021	0.038	0.004	0.036	0.018	0.004	
rs11264224	185.478	1	0.055	0.002	0.078	0.020	0.005	
rs113580743	72.208	0.009	0.104	0.009	0.022	0.003	0.002	
rs115697580	23.463	0.002	0.004	0.004	0.009	0.003	0.120	
rs115880387	20.011	0.042	0.002	0.002	0.013	0	0.001	
rs116568035	19.992	0.039	0.005	0.014	0.020	0.006	0.006	
rs116805289	58.127	0.004	0.001	0.004	0.010	0.003	0.002	
rs138398618	24.122	0.002	0.002	0.002	0.006	0.003	0	
rs139952834	36.833	0.005	0.005	0.003	0.017	0.005	0.003	
rs147700711	17.457	0.002	0.002	0.002	0.005	0	0.064	
rs147745605	23.495	0.003	0.003	0.028	0.014	0.002	0.001	
rs149551556	49.326	0.003	0.001	0.003	0.006	0.002	0.001	
rs2297607	36.414	0.010	0.033	0.204	0.021	0.022	0.330	
rs3103309	37.580	0.007	0.003	0.023	0.031	0.017	0.032	
rs35717427	211.703	0.009	0.004	0.037	0.144	0.017	0.014	
rs3766924	165.809	0.055	0.994	0.014	0.078	0.026	0.014	
rs41269913	135.903	0.005	0.007	0.009	0.083	0.008	0.003	
rs4129267	5041.904	0.078	0.076	0.011	1	0.077	0.024	
rs4633282	458.499	0.050	0	0.033	0.140	0.030	0.009	
rs56258967	16.802	0.017	0.002	0.002	0.018	0.002	0.001	
rs61806853	74.839	0.008	0.003	0	0.008	0.004	0.004	
rs7525477	180.033	0.004	0	0.028	0.086	0.161	0.065	
rs76289529	96.376	0.004	0.006	0.002	0.060	0.006	0.004	
rs76518735	37.337	0.008	0.006	0	0.018	0.002	0.002	
rs77994623	405.753	0.007	0.037	0.005	0.085	0.018	0.007	
rs79219014	97.719	0.002	0.004	0.015	0.032	0.003	0	
rs79438587	143.574	0.019	0.011	0.011	0.031	0.068	0.021	
rs79778789	78.363	0.040	0.001	0.003	0.020	0.001	0.002	

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Note: SNPs with R²>0.1 are highlighted in bold. Estimates were obtained using the *LDmatrix* function of the *LDlinkR* package in *R* and European ancestry reference population. ^aF-statistics were computed using the approximation $F = \frac{beta^2}{SE^2}$. ^{15,32}

Assessment of Horizontal Pleiotropy

We performed various sets of additional analyses to assess the possibility of horizontal pleiotropy, which describes effects of genetic instruments on the outcome independent of the exposure.

For genetic instruments focussed on genetic loci (termed *cis*-MR in the literature³³), we repeated IVW MR analyses with a reduced set of SNPs *within CRP* (GRCh37/hg19 coordinates: chr1:159,382,079-159,984,379) and *IL-6R* (GRCh37/hg19 coordinates: chr1:154,377,669-154,441,926) genes (cf. Table 2). For instruments including variants across the genome, we applied MR Egger estimation, which estimates an intercept indicating (and accounting for) directional horizontal pleiotropy, but has reduced statistical power, particularly with small number of SNPs.^{34–36}

We also performed leave-one-out (LOO) and single-SNP MR analyses (using Wald ratio estimation) to identify potential outlying SNPs driving results. For all MR analyses with evidence for significant heterogeneity, as indexed by significant *Q*-statistic, we explored the functional role of outlying SNPs with highly significant (P<0.001) single-SNP MR associations. To this end, we searched whether SNPs were eQTLs in brain tissue using the GTEx catalog and by obtaining the top hit from Phenome-wide Association Study (PheWAS) in UK Biobank traits using the PheWAS implementation of the MR Base platform (http://phewas.mrbase.org/).^{26,37}

eTable 7. Number of SNPs available for MR Analyses Across Outcome Instruments

Number of SNPs					
Exposure	PHQ-9 Symptoms	MD (Howard <i>et al.</i>)	MD (Wray et al.)	Insomnia	
Main MR analyses			,		
↑CRP levels	17	18	19	17	
↑IL-6 signalling	6	6	6	5	
Additional MR analyses					
↑CRP levels (alternative approach)	139	144	149	131	
↑IL-6 signalling (alternative approach)	29	28	28	22	
↑BMI	95	95	95	93	
Gene-restricted MR analyses					
↑CRP levels	1	1	1	1	
↑IL-6 signalling	3	3	3	2	
↑IL-6 signalling (alternative approach)	7	6	7	5	

eResults. Supplemental Results

LDSC Regression Analyses

eTable 8. LDSC Regression Estimates of CRP levels, BMI, MD, Height and Depressive Symptoms

				h^2	
Phenotype	Mean χ ²	λ_{GC}^{a}	Intercept (SE)	Estimate (SE)	Z
CRP levels	1.4020	1.2136	1.0135 (0.0113)	0.0941 (0.0147)	6.40
BMI	1.2603	1.0772	0.6729 (0.0076)	0.1297 (0.0056)	23.16
MD (Howard et al.)	1.5877	1.4494	1.0009 (0.0098)	0.0599 (0.0023)	26.04
MD (Wray et al.)	1.2124	1.1973	0.9976 (0.0090)	0.0723 (0.0049)	14.76
Insomnia	1.3659	1.3101	1.0152 (0.0089)	0.0457 (0.0020)	22.85
Height	2.9486	2.0007	1.3254 (0.0185)	0.3120 (0.0141)	22.13
Depressive Symptoms					
1: Anhedonia	1.0911	1.0895	0.9999 (0.0075)	0.0386 (0.0047)	8.21
2: Depressed mood	1.0930	1.0802	0.9977 (0.0074)	0.0400 (0.0048)	8.33
3: Sleep problems	1.1254	1.1175	1.0019 (0.0076)	0.0528 (0.0052)	10.15
4: Tiredness	1.1504	1.1333	1.0013 (0.0075)	0.0631 (0.0055)	11.47
5: Changes in appetite	1.1233	1.1144	1.0063 (0.0077)	0.0497 (0.0051)	9.75
6: Feelings of inadequacy	1.0879	1.0833	1.0073 (0.0064)	0.0350 (0.0045)	7.78
7: Concentration problems	1.0887	1.0833	0.9993 (0.0081)	0.0379 (0.0052)	7.29
8: Psychomotor changes	1.0484	1.0436	0.9947 (0.0063)	0.0231 (0.0043)	5.37
9: Suicidality	1.0393	1.0405	1.0059 (0.0065)	0.0143 (0.0036)	3.97

Note: ${}^{a}\lambda_{GC}$ refers to the genomic inflation factor, which is calculated as the median χ^{2} statistic across SNPs divided by the median χ^{2} statistic of the expected χ^{2} distribution. If $\lambda_{GC}>1$, this indicates potential systematic biases in GWAS (e.g., population stratification).

eTable 9. Genetic Correlation Estimates from LDSC Regression

Phenotype 1	Phenotype 2 (PHQ-9 Symptoms)	r _g (SE)	P	P_{FDR}^a	r _g intercept (SE)
CRP levels	1: Anhedonia	0.251 (0.053)	< 0.001	< 0.001	0.9999 (0.0075)
CRP levels	2: Depressed mood	0.152 (0.056)	0.006	0.006	0.9977 (0.0074)
CRP levels	3: Sleep problems ^b	0.153 (0.05)	0.002	0.003	1.0019 (0.0076)
CRP levels	4: Tiredness	0.188 (0.04)	< 0.001	< 0.001	1.0013 (0.0075)
CRP levels	5: Changes in appetite ^b	0.362 (0.067)	< 0.001	< 0.001	1.0063 (0.0077)
CRP levels	6: Feelings of inadequacy	0.178 (0.054)	0.001	0.002	1.0073 (0.0064)
CRP levels	7: Concentration problems	0.176 (0.060)	0.003	0.004	0.9993 (0.0081)
CRP levels	8: Psychomotor changes ^b	0.207 (0.076)	0.006	0.006	0.9947 (0.0063)
CRP levels	9: Suicidality	0.258 (0.081)	0.001	0.003	1.0059 (0.0065)
BMI	1: Anhedonia	0.228 (0.036)	< 0.001	< 0.001	0.9982 (0.0077)
BMI	2: Depressed mood	0.169 (0.034)	< 0.001	< 0.001	0.9962 (0.007)
BMI	3: Sleep problems ^b	0.154 (0.035)	< 0.001	< 0.001	0.9992 (0.007)
BMI	4: Tiredness	0.209 (0.028)	< 0.001	< 0.001	0.9984 (0.008)
BMI	5: Changes in appetite ^b	0.552 (0.038)	< 0.001	< 0.001	1.0104 (0.0077)
BMI	6: Feelings of inadequacy	0.195 (0.041)	< 0.001	< 0.001	1.0073 (0.0069)
BMI	7: Concentration problems	0.205 (0.034)	< 0.001	< 0.001	0.9957 (0.008)
BMI	8: Psychomotor changes ^b	0.311 (0.052)	< 0.001	< 0.001	0.9938 (0.0071)
BMI	9: Suicidality	0.228 (0.071)	0.001	0.001	1.006 (0.0066)
Height	1: Anhedonia	-0.018 (0.037)	0.615	0.791	0.9988 (0.0078)
Height	2: Depressed mood	-0.024 (0.041)	0.560	0.791	0.9964 (0.0071)
Height	3: Sleep problems ^b	-0.03 (0.035)	0.378	0.680	0.9992 (0.007)
Height	4: Tiredness	-0.002 (0.034)	0.964	0.977	0.9991 (0.0081)
Height	5: Changes in appetite ^b	-0.05 (0.034)	0.143	0.441	1.0096 (0.0077)
Height	6: Feelings of inadequacy	-0.001 (0.043)	0.977	0.977	1.008 (0.0069)
Height	7: Concentration problems	-0.046 (0.036)	0.196	0.441	0.9956 (0.0082)
Height	8: Psychomotor changes ^b	-0.064 (0.045)	0.155	0.441	0.9933 (0.007)
Height	9: Suicidality	-0.094 (0.058)	0.102	0.441	1.0057 (0.0068)
MD	1: Anhedonia	0.743 (0.068)	< 0.001	< 0.001	0.9973 (0.0081)
MD	2: Depressed mood	0.771 (0.065)	< 0.001	< 0.001	0.992 (0.0078)
MD	3: Sleep problems ^b	0.587 (0.052)	< 0.001	< 0.001	0.9904 (0.0083)

MD	4: Tiredness	0.719 (0.053)	< 0.001	< 0.001	0.9965 (0.009)
MD	5: Changes in appetite ^b	0.664 (0.058)	< 0.001	< 0.001	1.006 (0.0086)
MD	6: Feelings of inadequacy	0.808 (0.074)	< 0.001	< 0.001	1.0075 (0.0074)
MD	7: Concentration problems	0.766 (0.07)	< 0.001	< 0.001	0.9936 (0.0086)
MD	8: Psychomotor changes ^b	0.806 (0.09)	< 0.001	< 0.001	0.9885 (0.0071)
MD	9: Suicidality	0.862 (0.136)	< 0.001	< 0.001	1.0053 (0.0071)

Note: The MD phenotype is based on Wray *et al.*,⁷ so excludes UK Biobank participants. ^aP-values were FDR-controlled across depressive symptoms for each phenotype using the Benjamini-Hochberg method. ³⁸ ^bPsychomotor changes, changes in appetite, and sleep problems reflect composite symptoms, which may obscure associations specific to one but not the other underlying symptom.

eTable 10. Genetic Correlation Estimates and Standard Errors between CRP levels, MD, insomnia, BMI, and Height

	CRP levels	BMI	MD	MD	Insomnia	Height
			(Howard et al.)	(Wray et al.)		
CRP levels	1					
BMI	0.465 (0.059)**	1				
MD (Howard et al.)	0.067 (0.029)*	0.086 (0.021)**	1			
MD (Wray et al.)	0.094 (0.035)*	0.117 (0.028)**	0.948 (0.022)**	1		
Insomnia	0.104 (0.038)*	0.136 (0.026)*	0.442 (0.025)**	0.462 (0.038)**	1	
Height	-0.08 (0.026)*	-0.063 (0.019)*	-0.06 (0.017)*	-0.06 (0.023)*	-0.05 (0.024)*	1

Note: *P<0.05, **P<0.001

Mendelian Randomisation Analyses

eTable 11. MR IVW Estimates of Genetic Instruments for CRP Levels, IL-6 Signalling, and BMI

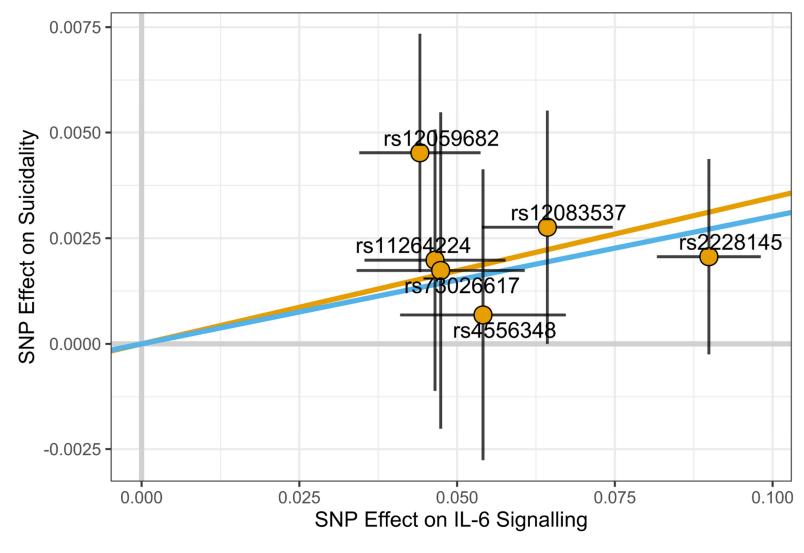
	CRP	levels		IL-6 signalling				BMI	
Outcome	Estimate (SE)	P	P _{FDR+B} . ^a	Estimate (SE)	P	P _{FDR+B} .a	Estimate (SE)	P	P _{FDR} ^a
MD (Howard <i>et al.</i>)	-0.033 (0.017)	0.051	-	-0.070 (0.052)	0.176	-	0.023 (0.037)	0.526	1
MD (Wray et al.)	-0.022 (0.032)	0.480	-	-0.106 (0.100)	0.289	-	0.077 (0.057)	0.177	ı
Insomnia	-0.016 (0.02)	0.415	-	0.011 (0.050)	0.827	-	-0.01 (0.039)	0.806	1
1: Anhedonia	-0.009 (0.009)	0.331	0.992	0.026 (0.022)	0.232	0.836	0.046 (0.012)	<0.001**	0.001**
2: Depressed mood	-0.01 (0.008)	0.237	0.854	0.017 (0.019)	0.377	0.969	0.019 (0.01)	0.068	0.103
3: Sleep problems ^b	-0.008 (0.014)	0.544	1	0.054 (0.034)	0.109	0.653	-0.008 (0.023)	0.723	0.723
4: Tiredness	0.016 (0.012)	0.172	0.774	0.042 (0.042)	0.316	0.948	0.049 (0.018)	0.008**	0.023*
5: Changes in appetite ^b	0.001 (0.009)	0.875	1	0.014 (0.021)	0.497	1	0.121 (0.013)	<0.001**	<0.001**
6: Feelings of inadequacy	-0.007 (0.011)	0.517	1	-0.003 (0.02)	0.884	1	0.028 (0.011)	0.010*	0.024*
7: Concentration problems ^b	-0.016 (0.008)	0.048	0.733	0.038 (0.019)	0.048	0.432	0.022 (0.011)	0.051	0.092
8: Psychomotor changes	-0.009 (0.005)	0.082	0.733	0.022 (0.016)	0.160	0.721	0.009 (0.007)	0.198	0.255
9: Suicidality	-0.007 (0.005)	0.122	0.733	0.035 (0.010)	0.001**	0.011*	-0.002 (0.005)	0.714	0.723

Note: Number of SNPs used differ per outcome and exact numbers are provided in eTable 7.^{15,32} ^aP-values were FDR-controlled across depressive symptoms of each outcome using the Benjamini-Hochberg method³⁸ and additional Bonferroni correction was applied for analysed two main exposure phenotypes on CRP levels and IL-6 signalling. ^bPsychomotor changes, changes in appetite, and sleep problems reflect composite symptoms, which may obscure associations specific to one but not the other underlying symptom. *P<0.05, **P<0.01

eTable 12. MR Weighted Median Estimates of Genetic Instruments for CRP Levels, IL-6 Signalling, and BMI

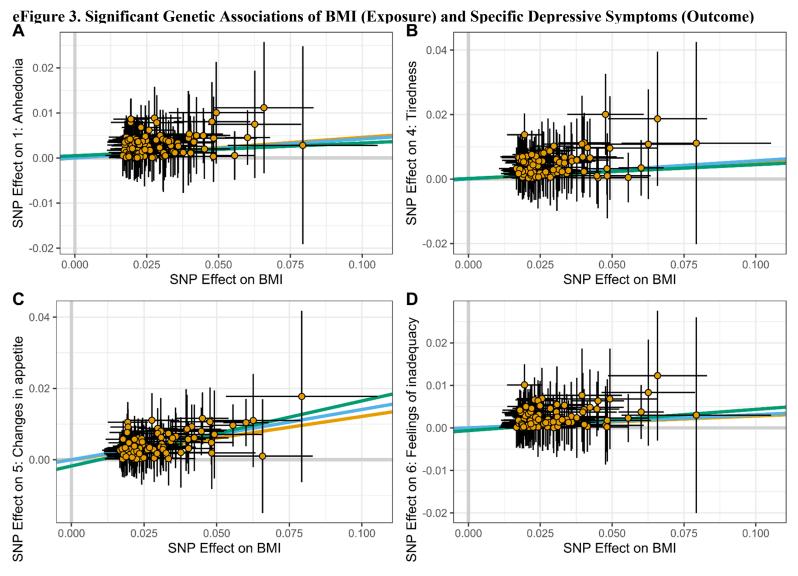
	CRP	levels		IL-6 s	signalling			BMI	
Outcome	Estimate (SE)	P	P _{FDR+B} .a	Estimate (SE)	P	P _{FDR+B} .a	Estimate (SE)	P	P_{FDR}^{a}
MD (Howard et al.)	-0.026 (0.021)	0.207	-	-0.039 (0.042)	0.345	-	0.04 (0.034)	0.248	-
MD (Wray et al.)	-0.015 (0.043)	0.721	-	-0.104 (0.093)	0.264	-	0.104 (0.069)	0.133	_
Insomnia	-0.013 (0.025)	0.609	-	0.046 (0.052)	0.381	-	-0.004 (0.039)	0.909	-
1: Anhedonia	-0.008 (0.011)	0.501	1	0.009 (0.024)	0.693	1	0.042 (0.016)	0.007**	0.030*
2: Depressed mood	-0.005 (0.012)	0.671	1	-0.001 (0.023)	0.973	1	-0.003 (0.016)	0.850	0.850
3: Sleep problems ^b	-0.013 (0.018)	0.453	1	0.058 (0.036)	0.102	0.615	-0.01 (0.027)	0.724	0.815
4: Tiredness	0.011 (0.016)	0.496	1	0.032 (0.034)	0.346	1	0.057 (0.023)	0.014*	0.041*
5: Changes in appetite ^b	0.002 (0.013)	0.866	1	0.023 (0.024)	0.346	1	0.141 (0.017)	<0.001**	<0.001**
6: Feelings of inadequacy	-0.017 (0.013)	0.167	0.751	-0.011 (0.024)	0.634	1	0.031 (0.016)	0.058	0.131
7: Concentration problems ^b	-0.015 (0.011)	0.165	0.751	0.036 (0.022)	0.102	0.615	0.024 (0.016)	0.123	0.221
8: Psychomotor changes	-0.01 (0.007)	0.137	0.751	0.02 (0.014)	0.159	0.715	0.010 (0.010)	0.347	0.521
9: Suicidality	-0.008 (0.006)	0.155	0.751	0.03 (0.011)	0.006**	0.109	0.003 (0.008)	0.681	0.815

Note: Number of SNPs used differ per outcome and exact numbers are provided in eTable 7.^{15,32} ^aP-values were FDR-controlled across depressive symptoms of each outcome using the Benjamini-Hochberg method³⁸ and additional Bonferroni correction was applied for analysed two main exposure phenotypes on CRP levels and IL-6 signalling. ^bPsychomotor changes, changes in appetite, and sleep problems reflect composite symptoms, which may obscure associations specific to one but not the other underlying symptom. *P<0.05, **P<0.01



eFigure 2. Genetic Associations of the Genetic Instrument for IL-6 Signalling (Exposure) and Suicidality (Outcome)

Note: Points represent GWAS-based effect sizes with standard errors. Orange and blue lines show MR IVW and weighted median slopes, respectively.



Note: Significant IVW MR associations of BMI with (A) anhedonia, (B) tiredness, (C) changes in appetite, and (D) feelings of inadequacy. Points represent GWAS-based effect sizes with standard errors. Orange, blue, and green lines show MR IVW, weighted median and MR Egger estimates, respectively.

eTable 13. MR Weighted Median Estimates of Alternative Genetic Instruments for CRP Levels (Genome-wide) and IL-6 Signalling (Indirect)

	CRP levels (genome-w	ride)	IL-6 signalling (indirect)			
Outcome	Estimate (SE)	P	PFDRa	Estimate (SE)	P	P _{FDR} ^a	
MD (Howard et al.)	-0.011 (0.015)	0.451	-	-0.003 (0.004)	0.394	-	
MD (Wray et al.)	-0.007 (0.03)	0.804	-	-0.009 (0.007)	0.247	-	
Insomnia	0.007 (0.018)	0.687	-	0.006 (0.004)	0.173	-	
1: Anhedonia	0.005 (0.008)	0.524	0.685	0.000 (0.002)	0.897	0.897	
2: Depressed mood	-0.005 (0.008)	0.539	0.685	-0.001 (0.002)	0.783	0.881	
3: Sleep problems ^b	0.011 (0.013)	0.369	0.664	0.005 (0.003)	0.104	0.408	
4: Tiredness	0.022 (0.012)	0.058	0.382	0.002 (0.003)	0.419	0.754	
5: Changes in appetite ^b	0.011 (0.009)	0.186	0.525	0.002 (0.002)	0.371	0.754	
6: Feelings of inadequacy	-0.004 (0.009)	0.609	0.685	-0.001 (0.002)	0.613	0.789	
7: Concentration problems	0.002 (0.008)	0.798	0.798	0.003 (0.002)	0.136	0.408	
8: Psychomotor changes ^b	-0.008 (0.005)	0.085	0.382	0.001 (0.001)	0.525	0.788	
9: Suicidality	0.005 (0.004)	0.233	0.525	0.002 (0.001)	0.047*	0.408	

Note: Number of SNPs used differ per outcome and exact numbers are provided in eTable 7.^{15,32} aP-values were FDR-controlled across depressive symptoms of each outcome using the Benjamini-Hochberg method.³⁸ bPsychomotor changes, changes in appetite, and sleep problems reflect composite symptoms, which may obscure associations specific to one but not the other underlying symptom. Significant results are highlighted in bold and marked with *P<0.05, **P<0.01.

Assessment of Horizontal Pleiotropy

We assessed horizontal pleiotropy for genetic instruments, which indicates if genetic variants are exerting an effect on the outcome variables independent of the exposure (i.e., violation of the *exclusion restriction* assumption).

Assessment of Heterogeneity Using Cochrane's Q
First, significant (P<0.05) heterogeneity of variant effects was assessed throughout IVW
estimates with Cochrane's Q statistic (see eTable 14). There was no evidence for horizontal
pleiotropy for the MR analyses using gene locus-based instruments except for the main IL-6
signalling instrument and tiredness (Q=12.04, P=0.034) and the alternative (indirect) IL-6
signalling instrument and MD as defined by Wray et al.⁷ (Q=45.76, P=0.013). Contrary to genebased instruments, the alternative CRP levels and BMI instruments, both based on variants
throughout the genome, showed evidence for heterogeneity for multiple outcome variables: There
was significant heterogeneity in IVW MR analyses of (i) CRP levels with depressed mood, sleep
problems, changes in appetite, feelings of inadequacy, suicidality, both MD phenotypes, and
insomnia and (ii) BMI with anhedonia, sleep problems, tiredness, both MD phenotypes, and

Gene-Restricted IVW MR Analyses

insomnia (see eTable 14).

Second, we repeated analyses for significant associations found with gene locus-based instruments by restricting the instruments to SNPs within CRP and IL-6R genes (eTable 16). With the restricted CRP levels instrument, as indexed by one SNP (rs1205), there was no evidence for association with any outcome. For IL-6 signalling, we replicated the IL-6 signalling-suicidality association for the main (direct) IL-6 signalling instrument (estimate=0.027, SE=0.011, P=0.013) and found an additional, significant association of this instrument with sleep problems (estimate=0.070, SE=0.034, P=0.037), both based on 3 SNPs within the IL-6R gene (cf. eTable 7). As the association with sleep problems was not found for the insomnia outcome

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(estimate=0.025, SE=0.107, P=0.814), it is likely that hypersomnia drives this association. We did not find significant associations of the gene-restricted alternative (indirect) IL-6 signalling instrument, based on 7 SNPs, with any symptom. However, the effect estimate with suicidality was similar in size (estimate=0.002, SE=0.002, P=0.176) and there was evidence for significant heterogeneity of indirect IL-6 signalling and suicidality MR analysis (Q=16.47, P=0.011). There was no evidence for heterogeneity in any other gene-restricted MR analysis (all P>0.05; eTable 15). In sum, we found evidence in favour of an association between IL-6 signalling and suicidality and some indication for an association between IL-6 signalling and sleep problems (likely driven by hypersomnia).

MR Egger Estimation of Genome-wide Instruments

Third, we conducted MR Egger estimation to evaluate directional horizontal pleiotropy for the CRP levels and BMI instruments based on genome-wide SNPs (eTable 17). MR Egger estimation allows estimation of an intercept (rather than fixing the intercept at zero as done in IVW and weighted median MR approaches), which describes directional effects of the instrument on the outcome not mediated via the exposure.³⁶ We did not find significant MR associations (i.e., slopes from MR Egger association) between CRP levels and any outcome variable. There was, however, evidence for significant heterogeneity based on a significant MR Egger intercept in the analysis of CRP levels and suicidality (intercept=0.001, SE=0.001, P=0.047).

For BMI, we found no significant MR Egger intercepts, so no evidence for directional horizontal pleiotropy. MR Egger slopes were only significant for the association with changes in appetite (estimate=0.183, SE=0.038, P<0.001). However, MR Egger slopes were similar in size between BMI and symptoms that were associated with BMI based on IVW and weighted median analyses (i.e., anhedonia, tiredness, changes in appetite, and feelings of inadequacy; cf. eFigure 3). As MR Egger estimation has reduced power compared to IVW and weighted median approaches and we

do not find evidence for directional horizontal pleiotropy from MR Egger intercepts,³⁶ we deem the similarity in slopes as reflective of the robustness of estimates.

Leave-one-out (LOO) and Single-SNP MR Approaches
Lastly, we conducted leave-one-out (LOO) and single-SNP MR analyses. LOO and forest plots
for all exposure-outcome MR combinations are available as additional files
(https://osf.io/ub83a/). In this supplement, we include LOO and forest plots for our main finding
of IL-6 signalling and suicidality (eFigure 4), which indicates that no single SNP is driving
significant results. We also provide those LOO and forest plots in eTables 18 and 19,
respectively, that arise from IVW MR analyses with evidence for significant heterogeneity (based
on P_Q <0.05). We further extracted all single SNP MR estimates from 'outlier SNPs', as defined
by their highly significant (P<0.001) associations with outcome variables, that were included in
instruments from these heterogeneous IVW analyses. We then manually assessed whether these
SNPs were eQTLs in brain tissue by extracting the top brain eQTL information from GTEx. We
further used the MR Base Phenome Wide Association Study (PheWAS) platform
(http://phewas.mrbase.org/) to extract the top phenotype associations with these SNPs (eTable
20).

These sensitivity analyses indicated that the association between the alternative CRP levels instrument and changes in appetite and MD was unstable; that is 95% CIs included/ excluded zero depending on the left-out SNP. In general, however, results were stable and not dependent upon individual SNPs as indicated in LOO analyses. Forest plots showed that for both BMI and genome-wide CRP levels instruments, there were individual SNPs with strong effects (both protective and risk-increasing). Manual exploration of these SNPs (cf. eTable 20) showed that most BMI SNPs had strong associations with metabolic traits from PheWAS even though 'weight-increasing' alleles were not consistently associated with higher/ lower depression

phenotypes. This could be an indication of horizontal pleiotropy and mechanisms of effect via other pathways.

For outlying SNPs associated with CRP levels, it was intriguing to see PheWAS traits were related to BMI, height, and other traits associated with metabolic dysregulation (e.g., broadband ultrasound attenuation).³⁹ This could potentially indicate that the heterogeneity in the genomewide CRP levels instrument was arising from a combination of SNPs associated with CRP levels and metabolic traits included in this instrument. This also emphasises further the value of choosing gene-based/ *cis*-instruments for MR analysis of CRP levels, which will be more specific to CRP activity.³³

Summary of Horizontal Pleiotropy Assessments

Horizontal pleiotropy, indicating SNP effects via pathways other than the exposure, was assessed based on significant heterogeneity (eTables 14-15), gene-restricted and MR Egger approaches (eTables 16-17), and by evaluating outlying SNP-effects with LOO and single-SNP MR approaches (eFigure 4, eTables 18-20).

These analyses indicated that main findings of IL-6 signalling and suicidality were stable and unlikely to be due to direct SNP-effects on suicidality. Significant IVW MR associations of higher BMI with anhedonia, tiredness, changes in appetite, and feelings of inadequacy only remained significant in MR Egger regression for changes in appetite but MR Egger slope effect sizes were similar in size and directionally consistent with IVW and weighted median MR estimates for all four symptoms. Accordingly, we report this as "directionally consistent" in main results as MR Egger regression has reduced statistical power as compared to IVW and weighted median approaches.³⁶

Lastly, outlier analyses (i.e., LOO, single-SNP MR & manual outlier exploration) showed that the alternative CRP levels instrument included SNPs with strong metabolic associations. This suggests the alternative, genome-wide CRP levels instrument is likely unspecific for CRP activity and confounded from metabolic effects, which emphasises the value of gene-based/ *cis*-MR approaches.

eTable 14. MR Heterogeneity Estimates (Cochrane's Q) of All Genetic Instruments

	Main MR analyses				Additional MR analyses						
	CRP levels II		IL-6 si	IL-6 signalling		CRP levels		IL-6 signalling		BMI	
					(genom	(genome-wide)		(indirect)			
Outcome	Q	P	Q	P	Q	P	Q	P	Q	P	
MD (Howard et al.)	20.89	0.231	10.85	0.055	242.07	<0.001**	30.02	0.313	354.55	<0.001**	
MD (Wray et al.)	14.01	0.729	9.16	0.103	184.89	0.021*	45.76	0.013*	191.35	<0.001**	
Insomnia	19.41	0.248	5.4	0.248	179.98	0.002**	8.89	0.990	269.11	<0.001**	
1: Anhedonia	19.15	0.261	6.52	0.259	154.55	0.159	35.13	0.166	123.17	0.023*	
2: Depressed mood	16.03	0.451	3.92	0.560	167.16	0.046*	16.87	0.951	93.03	0.509	
3: Sleep problems	16.77	0.401	6.35	0.273	170.95	0.030*	19.93	0.867	193.83	<0.001**	
4: Tiredness	11.99	0.745	12.04	0.034*	143.21	0.363	27.64	0.483	144.45	0.001**	
5: Changes in appetite	15.01	0.524	5.09	0.405	190.87	0.002**	22.06	0.779	117.34	0.052	
6: Feelings of inadequacy	25.53	0.061	3.79	0.580	173.36	0.022*	32.57	0.252	95.91	0.426	
7: Concentration problems	8.34	0.938	5.21	0.390	151.71	0.201	34.7	0.179	109.75	0.127	
8: Psychomotor changes	17.46	0.356	8.74	0.120	131.78	0.633	39.97	0.067	103.77	0.230	
9: Suicidality	19.59	0.239	5.77	0.329	188.42	0.003**	39.87	0.068	90.69	0.578	

Note: Number of SNPs used differ per outcome and exact numbers are provided in eTable 7.^{15,32} Significant results are highlighted in bold and marked with *P<0.05, **P<0.01

eTable 15. MR Heterogeneity Estimates (Cochrane's Q) of Gene-Restricted IL-6 Signalling Genetic Instruments

	IL-6 signa	lling	IL-6 signalling (indirect)	
Outcome	Q	P	Q	P	
MD (Howard et al.)	2.83	0.243	2.74	0.740	
MD (Wray et al.)	2.73	0.255	11.57	0.072	
Insomnia	4.75	0.029*	2.82	0.588	
1: Anhedonia	2.69	0.260	7.00	0.321	
2: Depressed mood	1.82	0.403	3.49	0.745	
3: Sleep problems	1.71	0.426	3.66	0.723	
4: Tiredness	4.80	0.090	5.32	0.503	
5: Changes in appetite	0.04	0.980	5.21	0.517	
6: Feelings of inadequacy	3.06	0.216	7.38	0.287	
7: Concentration problems	0.01	0.995	9.65	0.140	
8: Psychomotor changes	1.75	0.417	10.95	0.090	
9: Suicidality	0.82	0.665	16.47	0.011*	

Note: Number of SNPs used differ per outcome and exact numbers are provided in eTable 7.^{15,32} Significant results are highlighted in bold and marked with *P<0.05, **P<0.01.

eTable 16. Gene-Restricted MR Estimates of Genetic Instruments for CRP Levels and IL-6 Signalling

						-
	CRP levels		IL-6 signa	IL-6 signalling		indirect)
Outcome	Estimate (SE)	P	Estimate (SE)	P	Estimate (SE)	P
MD (Howard et al.)	-0.026 (0.025)	0.307	-0.061 (0.047)	0.199	-0.006 (0.004)	0.071
MD (Wray et al.)	-0.013 (0.051)	0.799	-0.064 (0.098)	0.513	-0.018 (0.01)	0.070
Insomnia	-0.016 (0.029)	0.579	0.025 (0.107)	0.814	0.006 (0.004)	0.134
1: Anhedonia	-0.01 (0.013)	0.467	0.023 (0.025)	0.360	0.000 (0.002)	0.895
2: Depressed mood	-0.012 (0.013)	0.380	0.018 (0.021)	0.398	-0.001 (0.002)	0.775
3: Sleep problems ^a	-0.015 (0.021)	0.483	0.070 (0.034)	0.037*	0.005 (0.003)	0.082
4: Tiredness	0.008 (0.019)	0.691	0.053 (0.047)	0.265	0.002 (0.003)	0.397
5: Changes in appetite ^a	0.004 (0.015)	0.809	0.023 (0.023)	0.326	0.003 (0.002)	0.187
6: Feelings of inadequacy	-0.018 (0.014)	0.205	-0.001 (0.028)	0.964	-0.003 (0.002)	0.191
7: Concentration problems	-0.015 (0.013)	0.267	0.037 (0.021)	0.083	0.003 (0.002)	0.197
8: Psychomotor changes ^a	-0.01 (0.008)	0.224	0.018 (0.013)	0.175	0.001 (0.002)	0.716
9: Suicidality	-0.01 (0.007)	0.154	0.027 (0.011)	0.013*	0.002 (0.002)	0.176

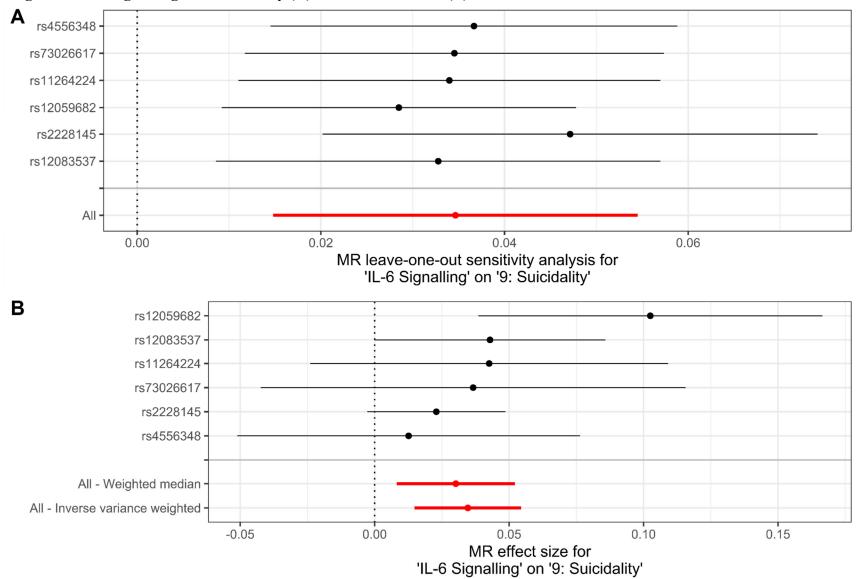
Note: Number of SNPs used differ per outcome and exact numbers are provided in eTable 7.^{15,32} aPsychomotor changes, changes in appetite, and sleep problems reflect composite symptoms, which may obscure associations specific to one but not the other underlying symptom. Significant results are highlighted in bold and marked with *P<0.05, **P<0.01.

eTable 17. MR Egger Estimates of Genetic Instruments for CRP Levels (Genome-wide) and BMI

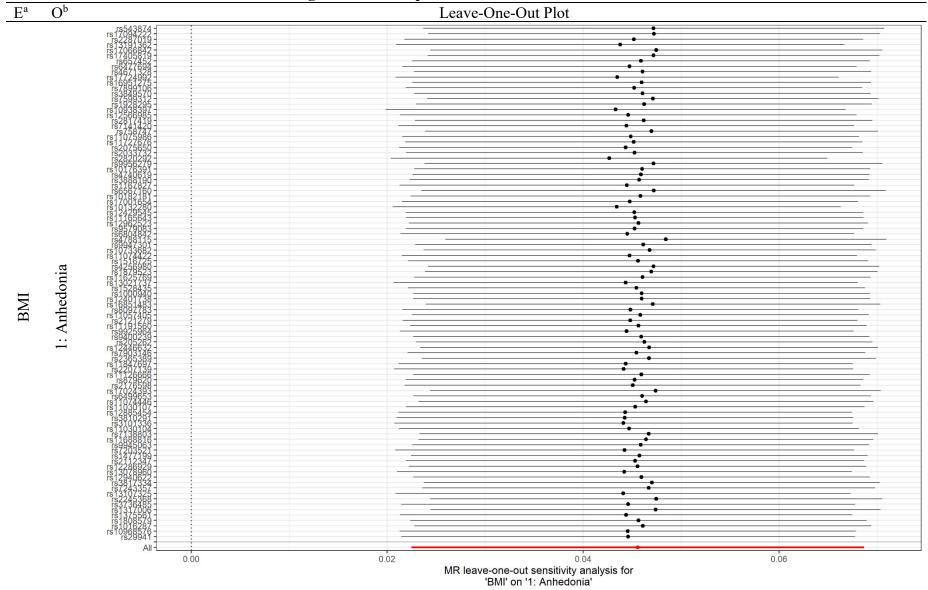
	CRP	nome-wide)	<u>BMI</u>					
	Egger Interc	ept	Egger Slo	pe	Egger Interd	cept	Egger Sl	ope
Outcome	Estimate (SE)	P	Estimate (SE)	P	Estimate (SE)	P	Estimate (SE)	P
MD (Howard et al.)	0 (0.001)	0.955	-0.022 (0.020)	0.292	0.000 (0.003)	0.986	0.022 (0.113)	0.850
MD (Wray et al.)	0.002 (0.002)	0.382	-0.008 (0.037)	0.839	0.002 (0.005)	0.603	-0.009 (0.174)	0.957
Insomnia	-0.001 (0.001)	0.573	0.000 (0.022)	0.990	0.004 (0.003)	0.173	-0.163 (0.118)	0.171
1: Anhedonia	0.000 (0.001)	0.928	0.002 (0.009)	0.858	0.001 (0.001)	0.611	0.028 (0.036)	0.438
2: Depressed mood	0.000 (0.001)	0.597	0.000 (0.009)	0.979	0.001 (0.001)	0.517	-0.001 (0.031)	0.986
3: Sleep problems ^a	0.000 (0.001)	0.787	0.008 (0.015)	0.591	0.002 (0.002)	0.423	-0.063 (0.072)	0.383
4: Tiredness	0.000 (0.001)	0.911	0.023 (0.013)	0.074	0.000 (0.002)	0.915	0.043 (0.056)	0.446
5: Changes in appetite ^a	0.001 (0.001)	0.047*	-0.006 (0.011)	0.567	-0.002 (0.001)	0.092	0.183 (0.038)	<0.001**
6: Feelings of inadequacy	0.000 (0.001)	0.656	-0.006 (0.01)	0.523	-0.001 (0.001)	0.487	0.050 (0.033)	0.138
7: Concentration problems	0.000 (0.001)	0.727	-0.007 (0.009)	0.415	0.000 (0.001)	0.827	0.029 (0.034)	0.402
8: Psychomotor changes ^a	0.000 (<0.001)	0.847	-0.005 (0.005)	0.351	0.000 (0.001)	0.571	0.020 (0.021)	0.341
9: Suicidality	0.000 (<0.001)	0.764	0.005 (0.005)	0.300	0.001 (<0.001)	0.059	-0.030 (0.016)	0.057

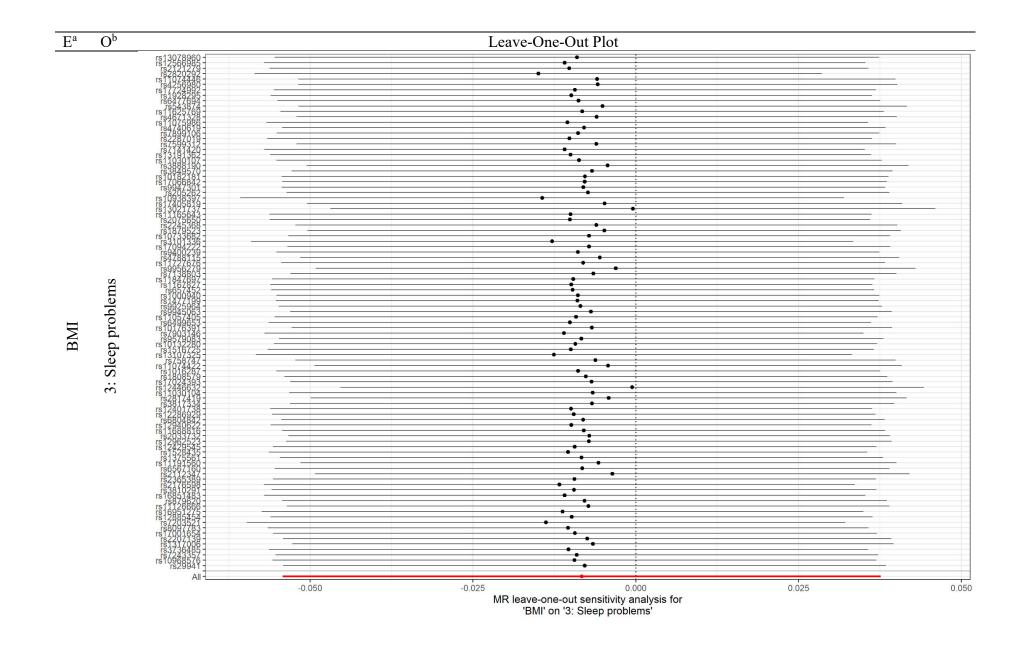
Note: Number of SNPs used differ per outcome and exact numbers are provided in eTable 7.^{15,32} aPsychomotor changes, changes in appetite, and sleep problems reflect composite symptoms, which may obscure associations specific to one but not the other underlying symptom. Significant results are highlighted in bold and marked with *P<0.05, **P<0.01.

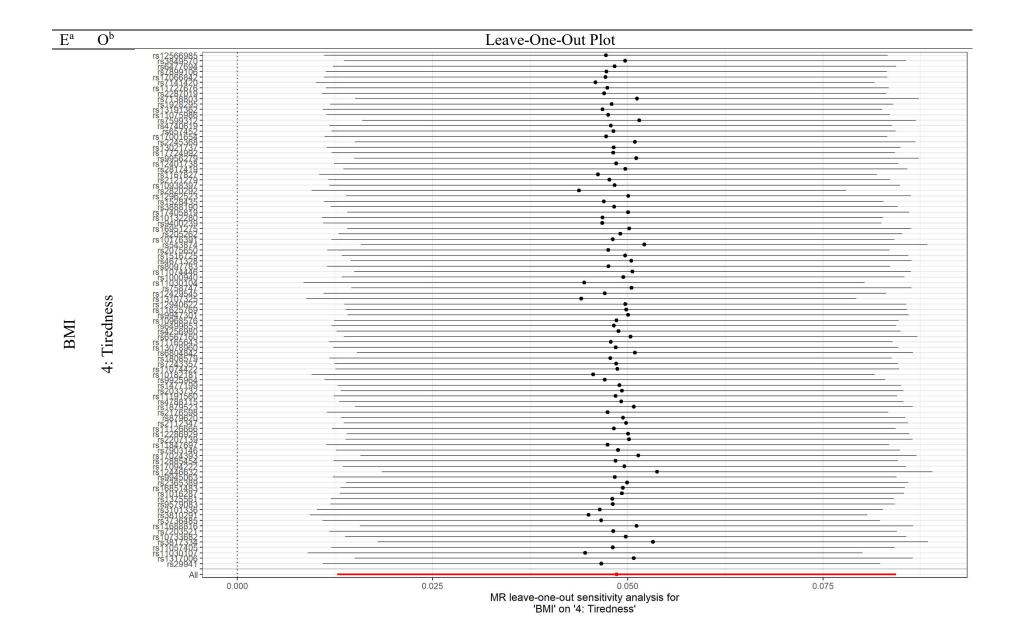
eFigure 4. IL-6 Signalling and Suicidality (A) Leave-one-out and (B) Forest Plots

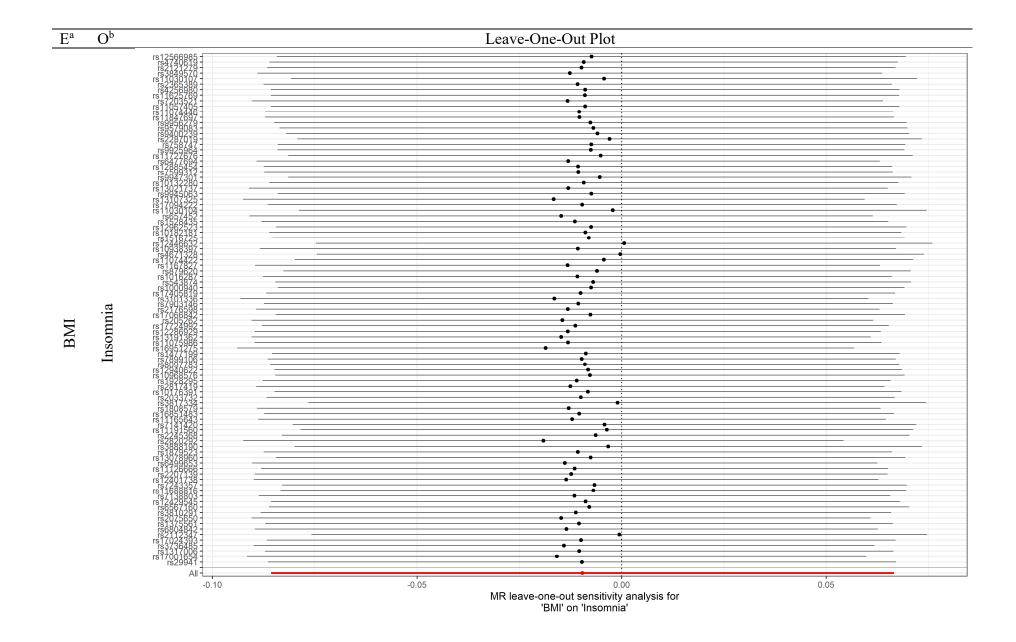


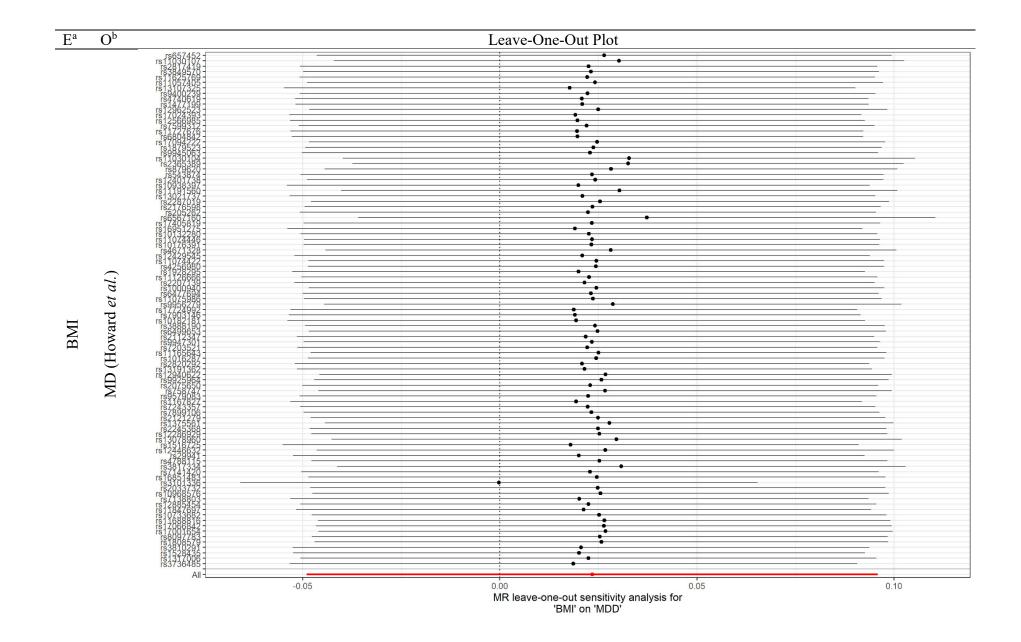
eTable 18. Leave-One-Out Plots for Heterogeneous MR Exposure-Outcome Associations

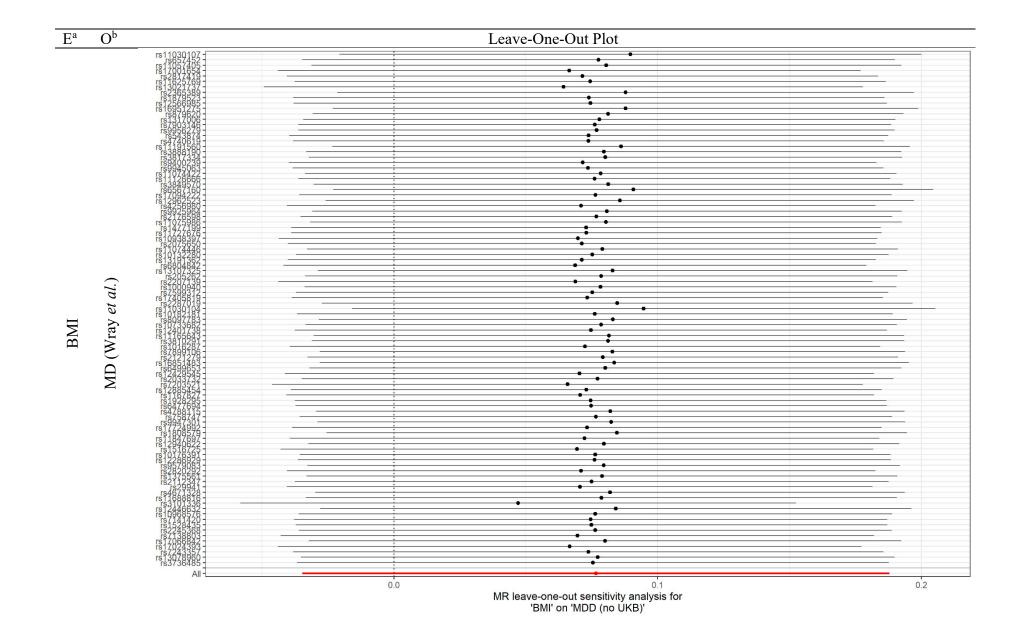


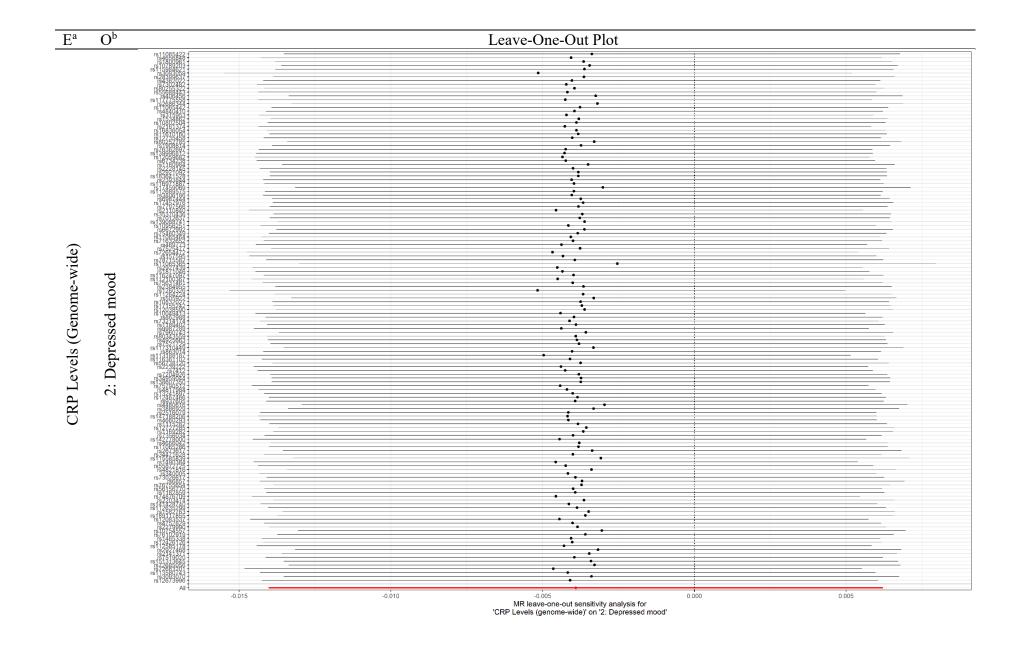


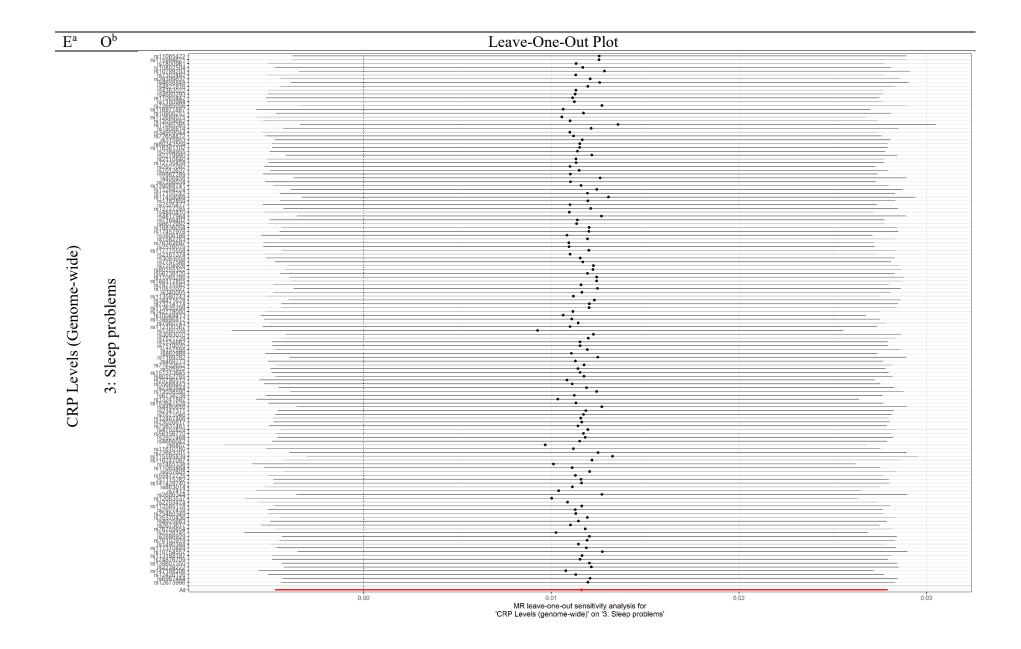


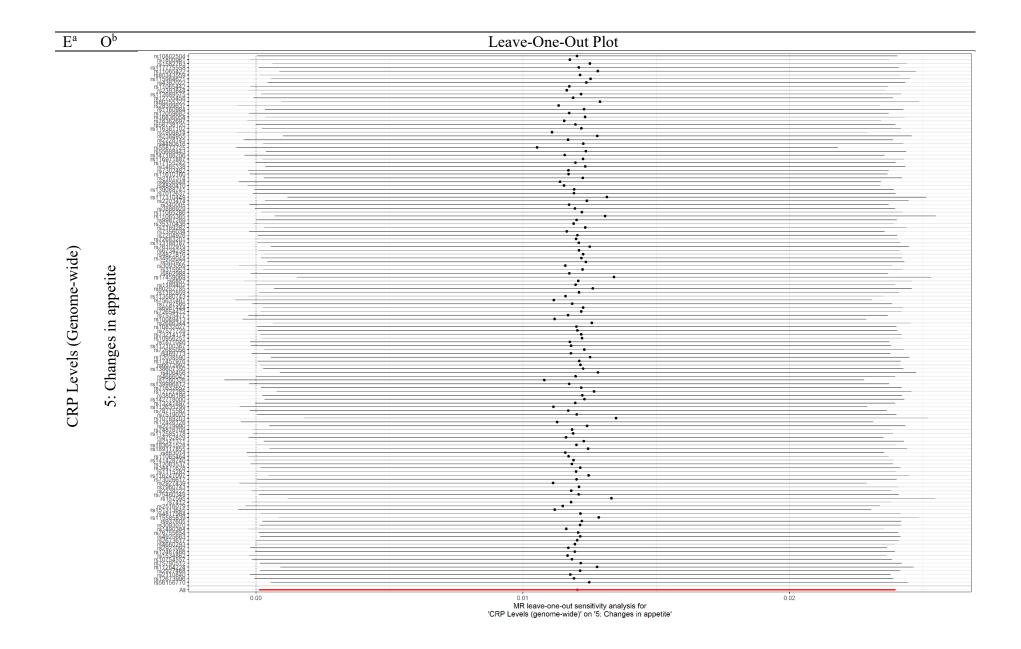


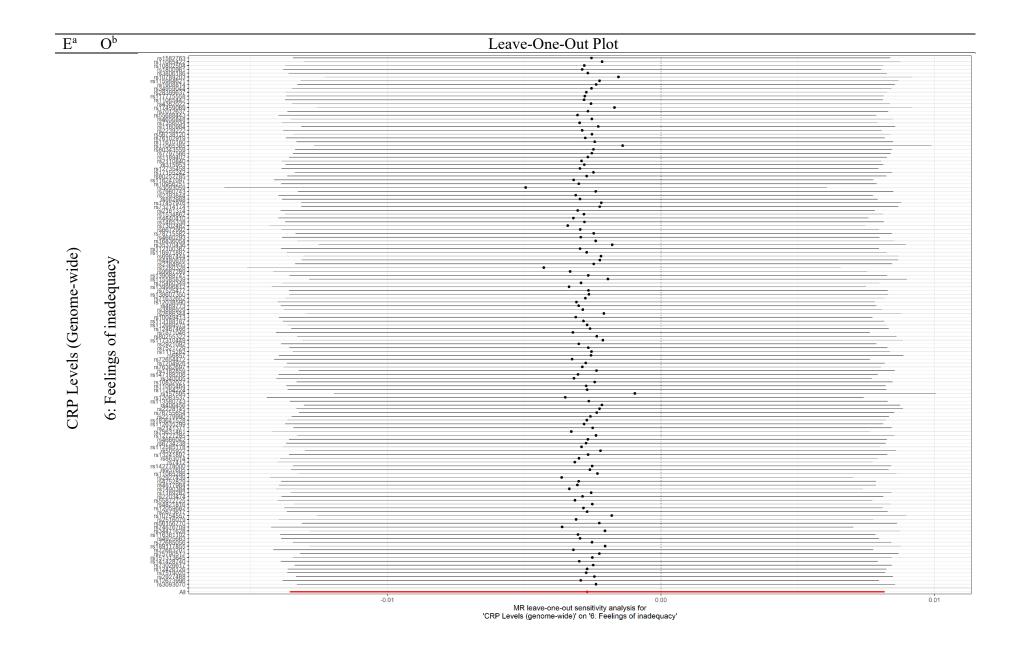


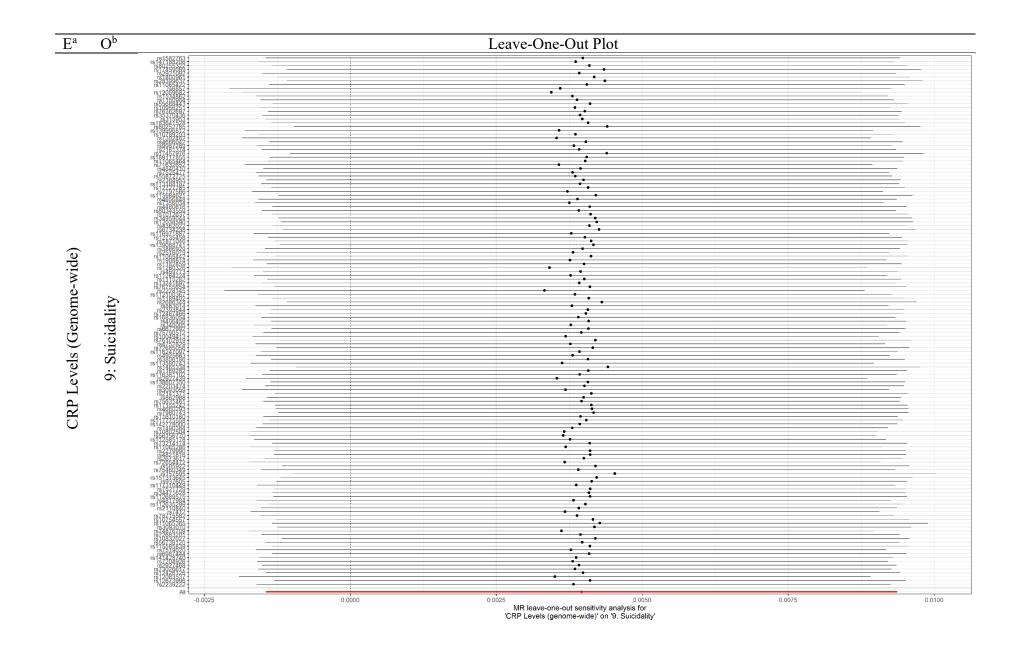


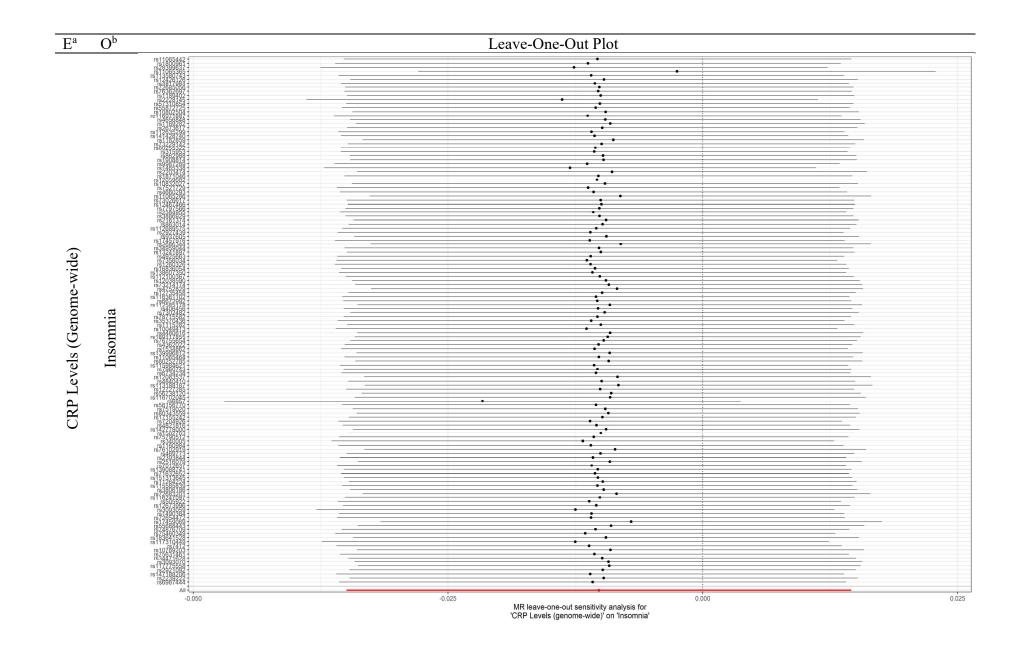


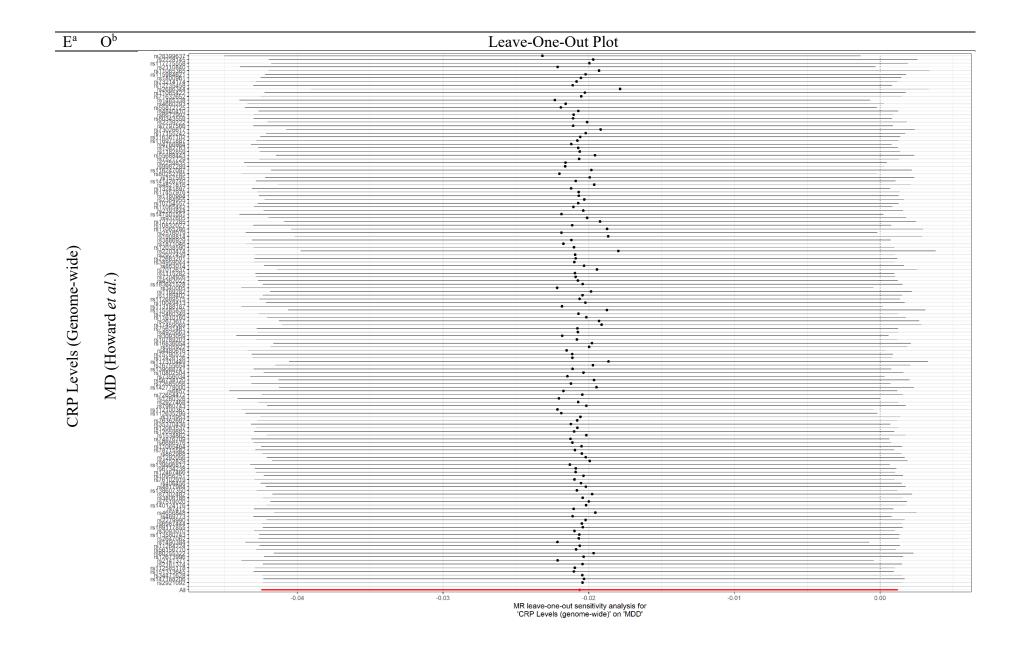


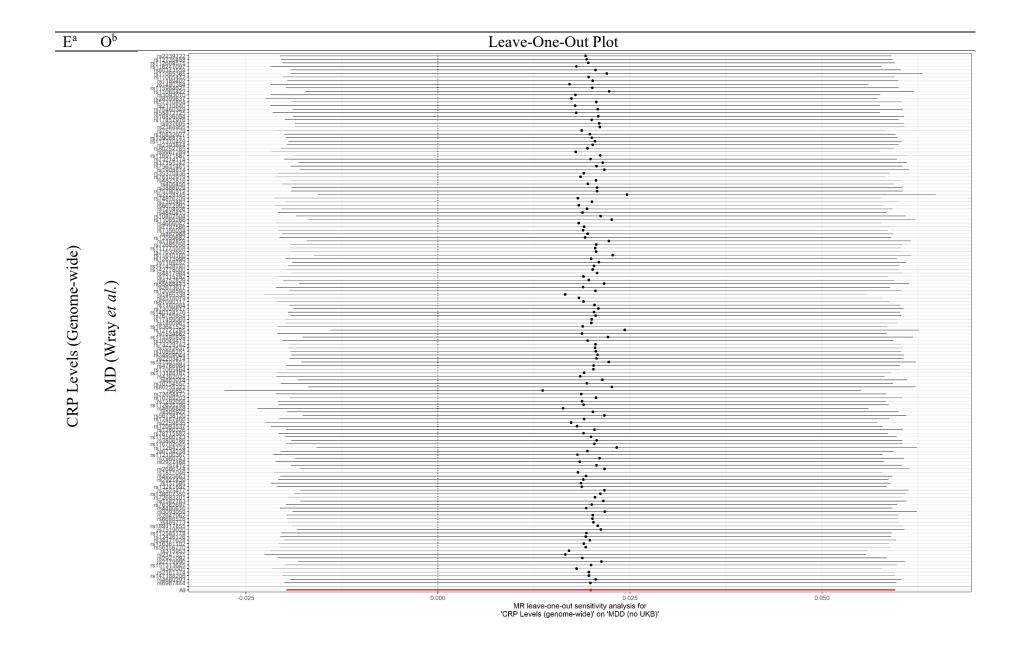


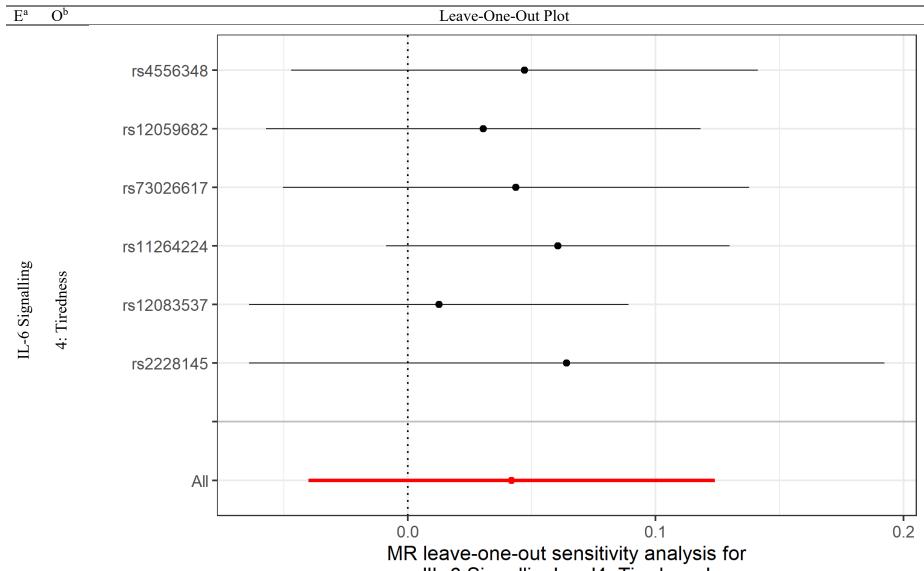




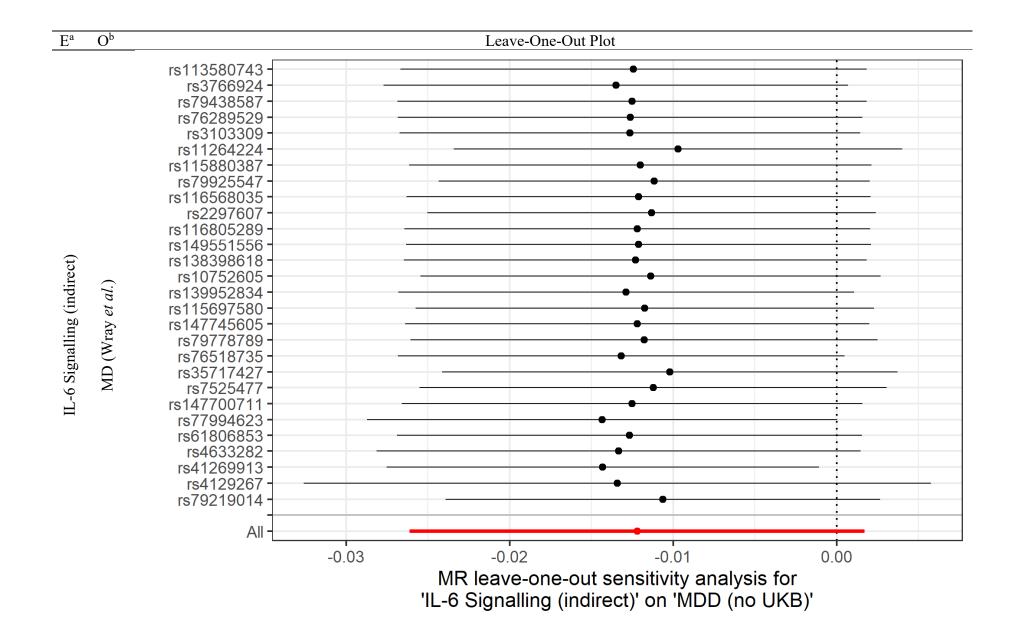


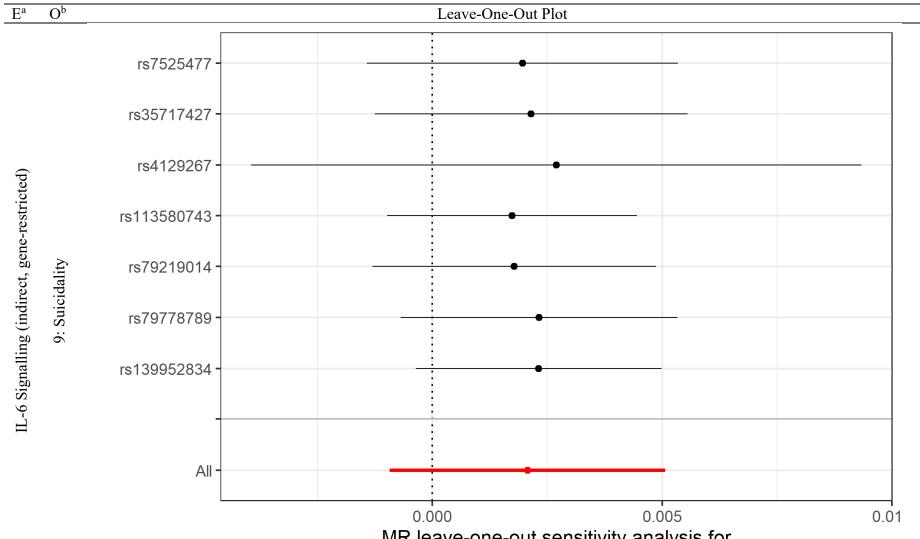






MR leave-one-out sensitivity analysis for 'IL-6 Signalling' on '4: Tiredness'

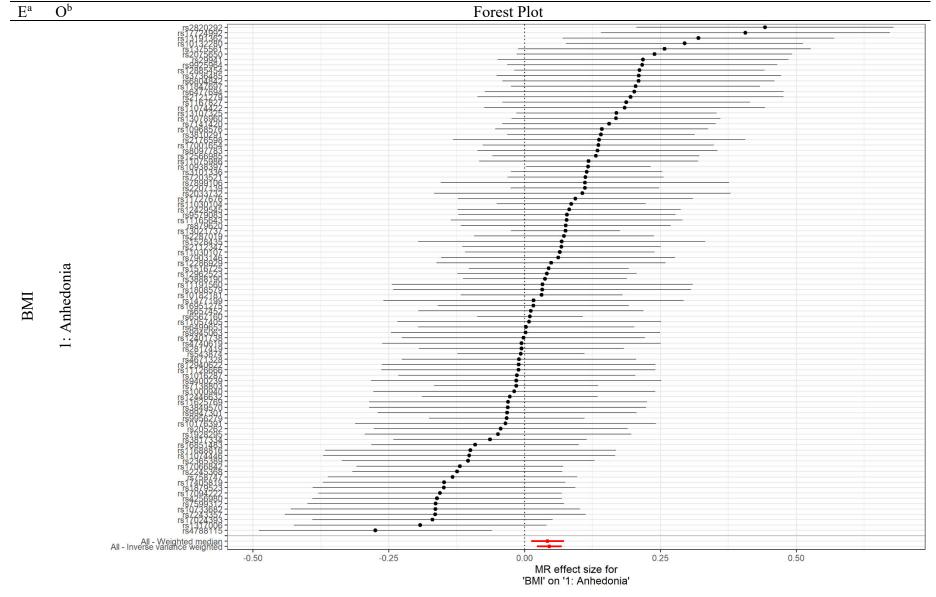


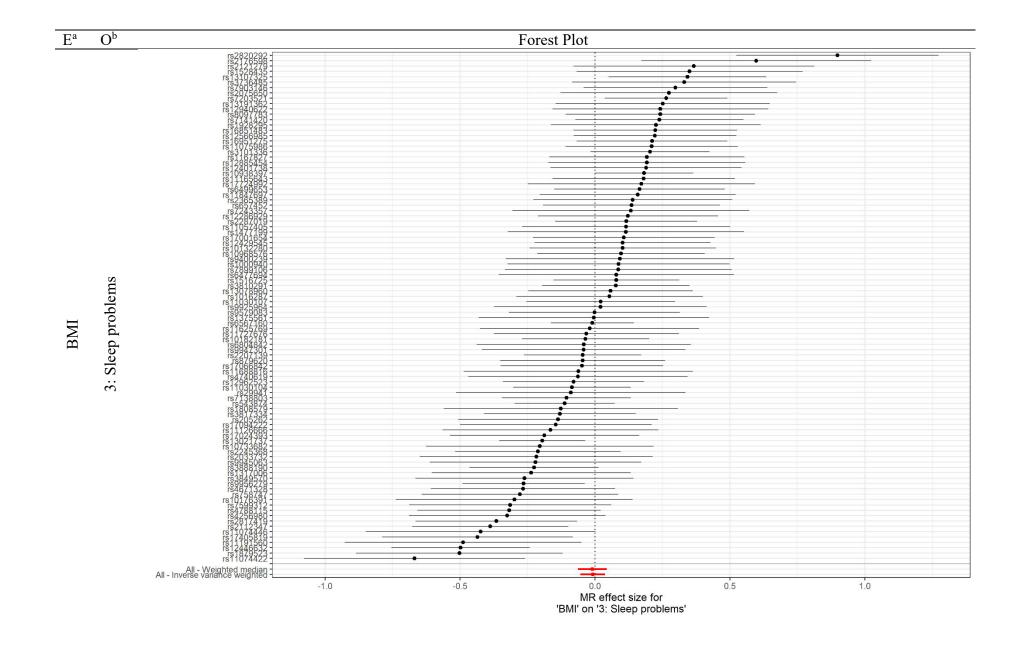


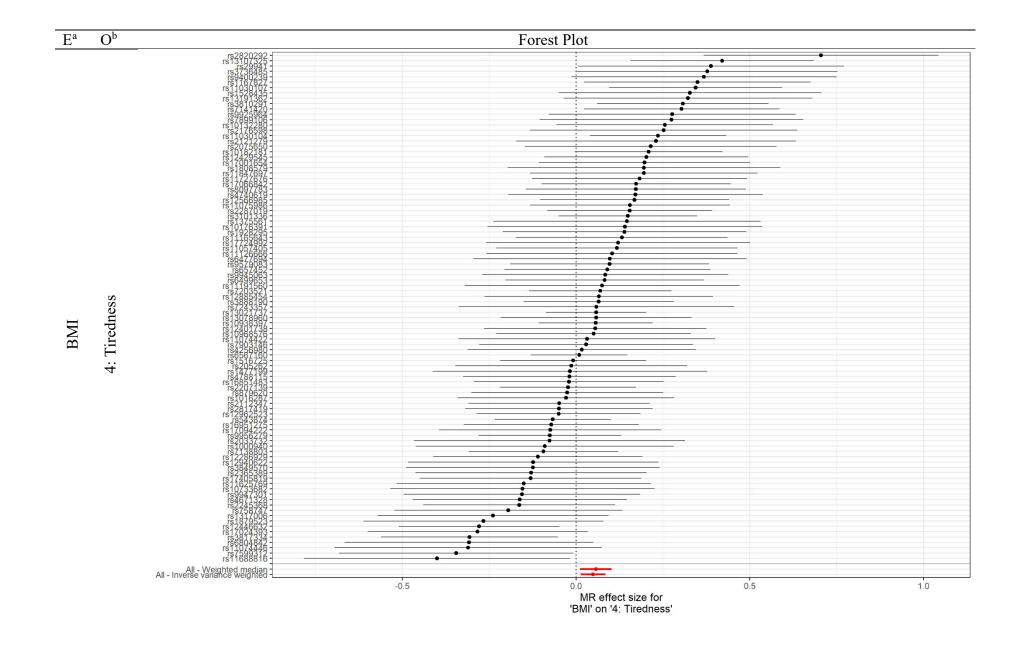
MR leave-one-out sensitivity analysis for 'IL-6 Signalling (indirect, gene-restricted)' on '9: Suicidality'

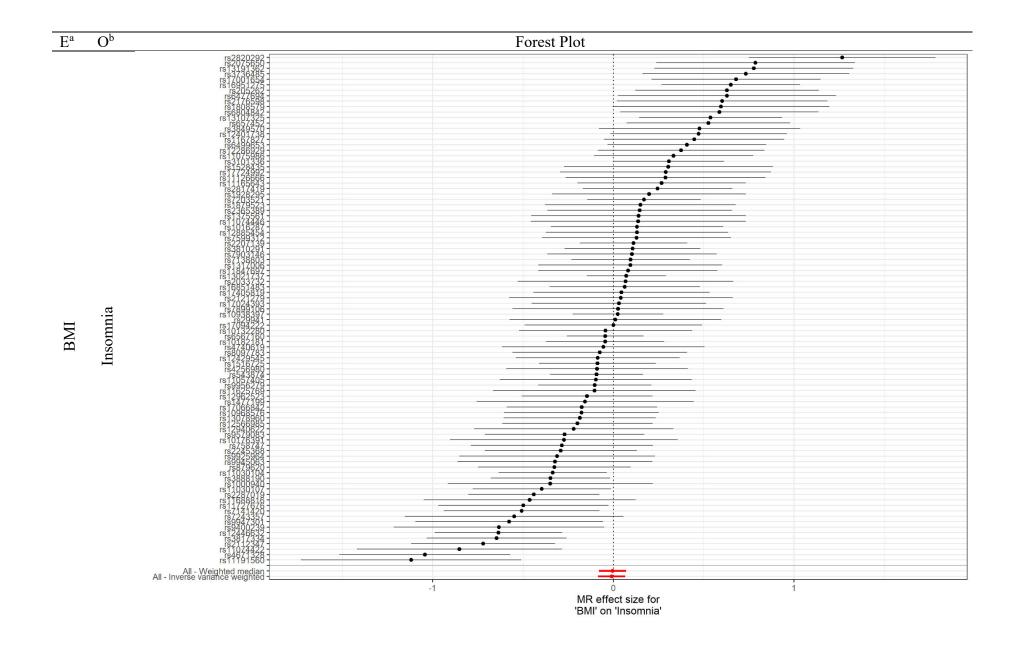
Note: ^aE=Exposure. ^bO=Outcome.

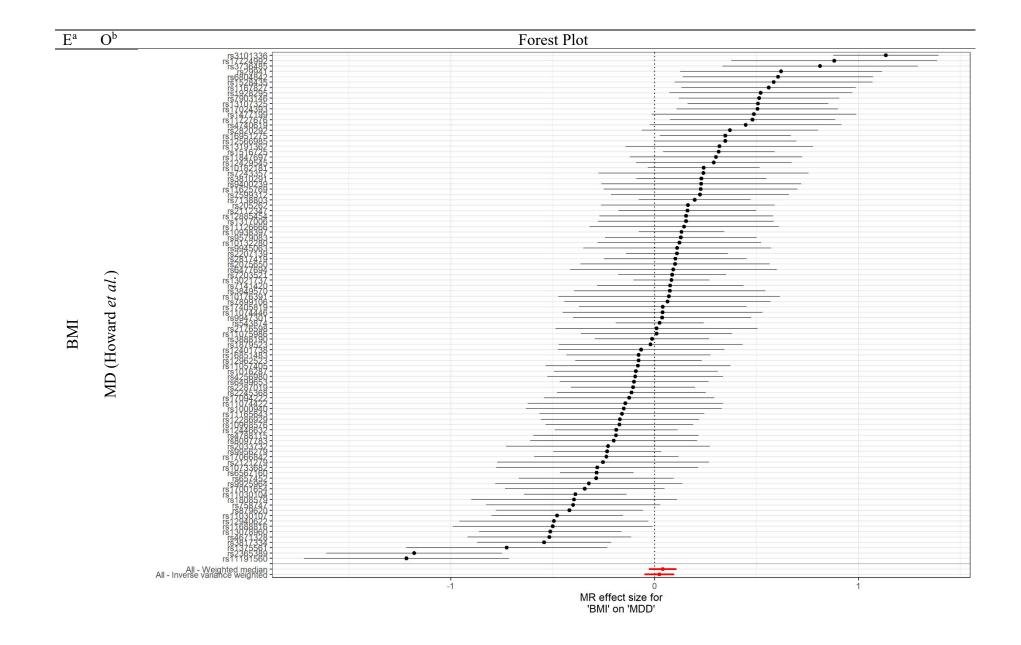
eTable 19. Forest Plots for Heterogeneous MR Exposure-Outcome Associations

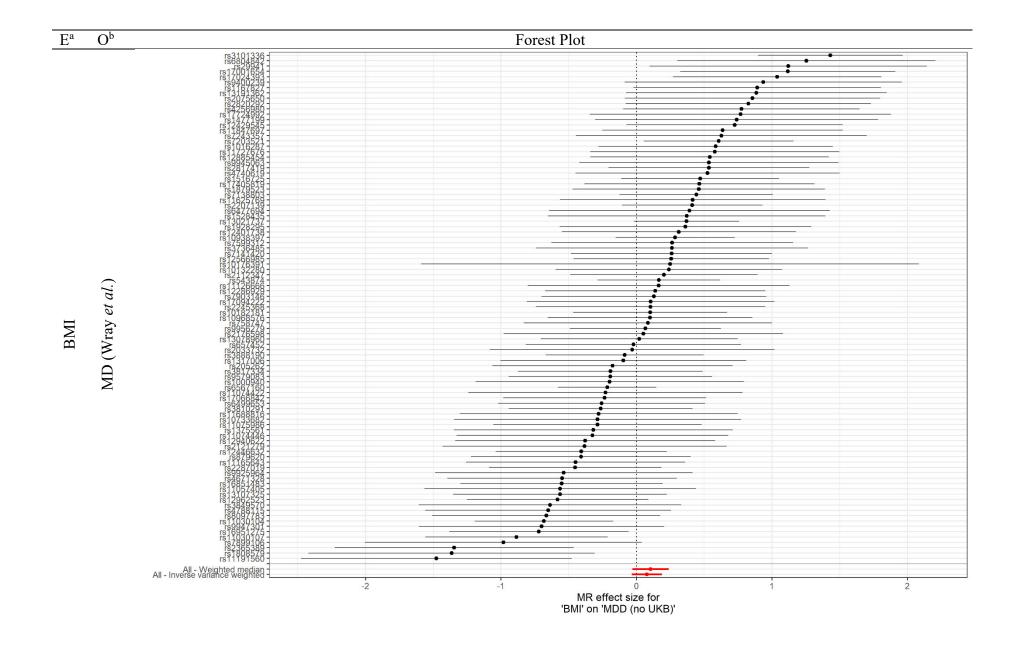


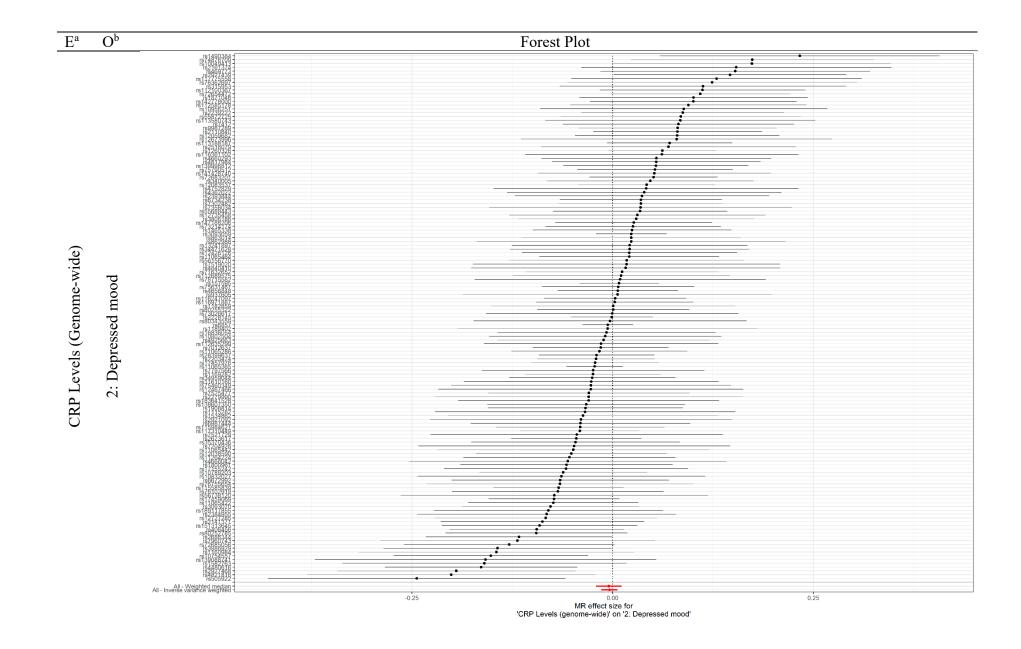


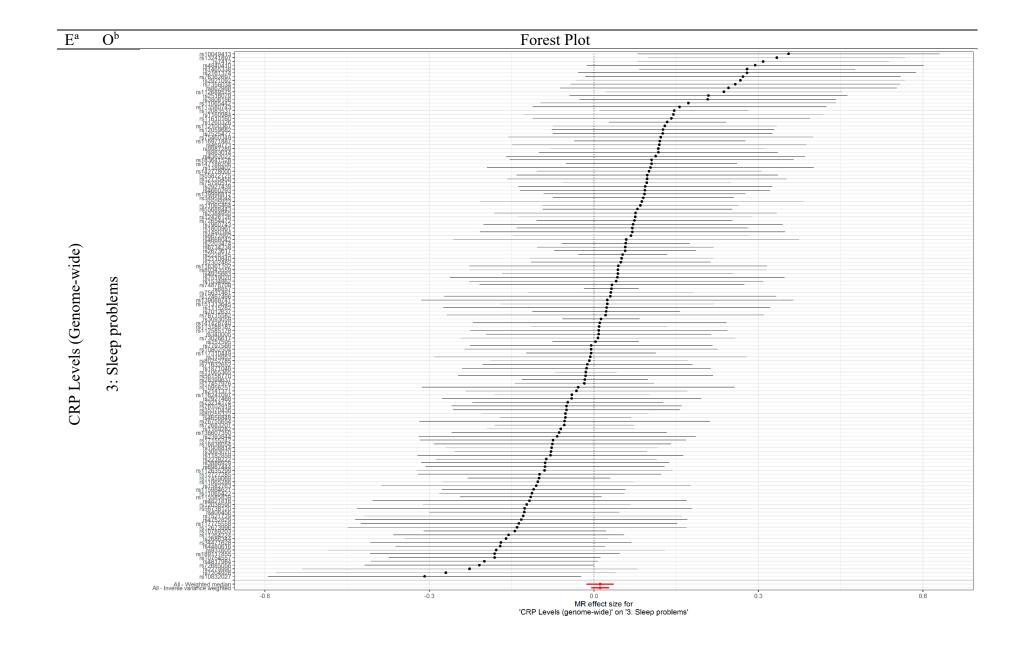


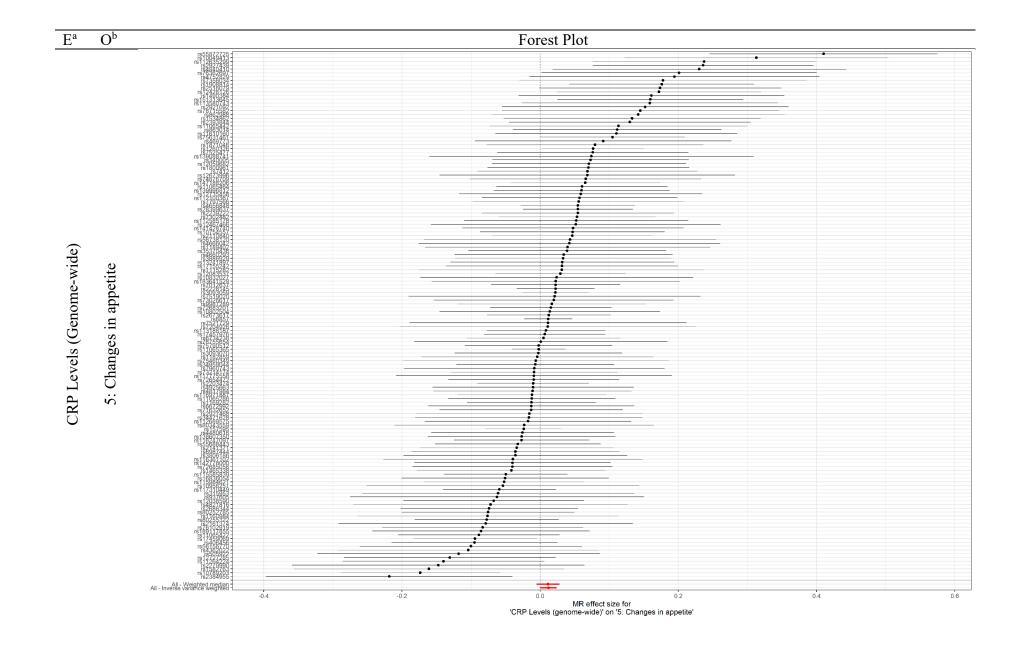


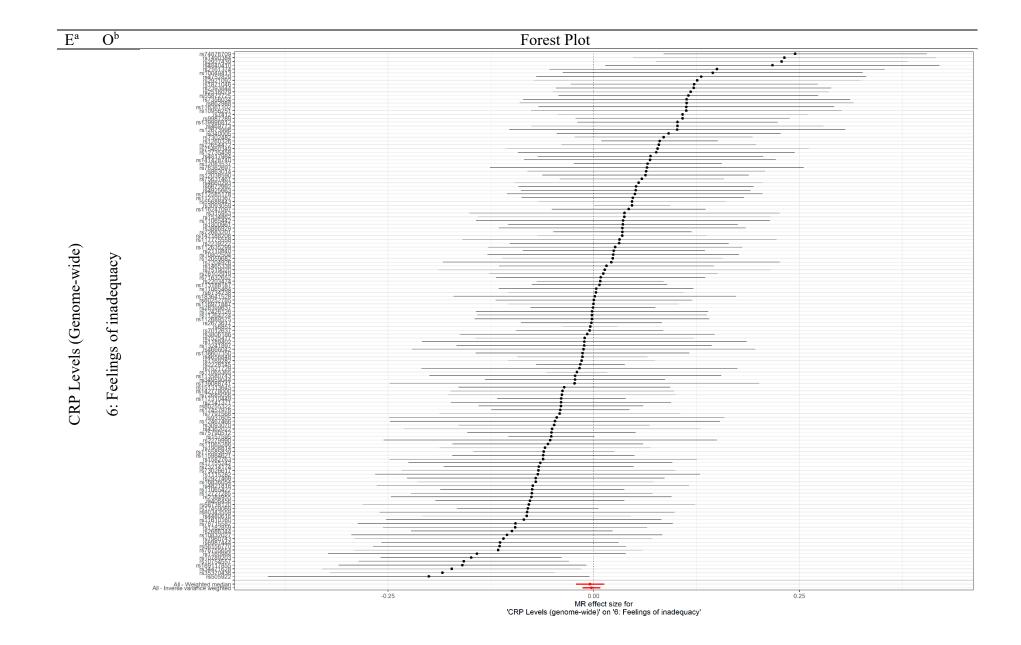


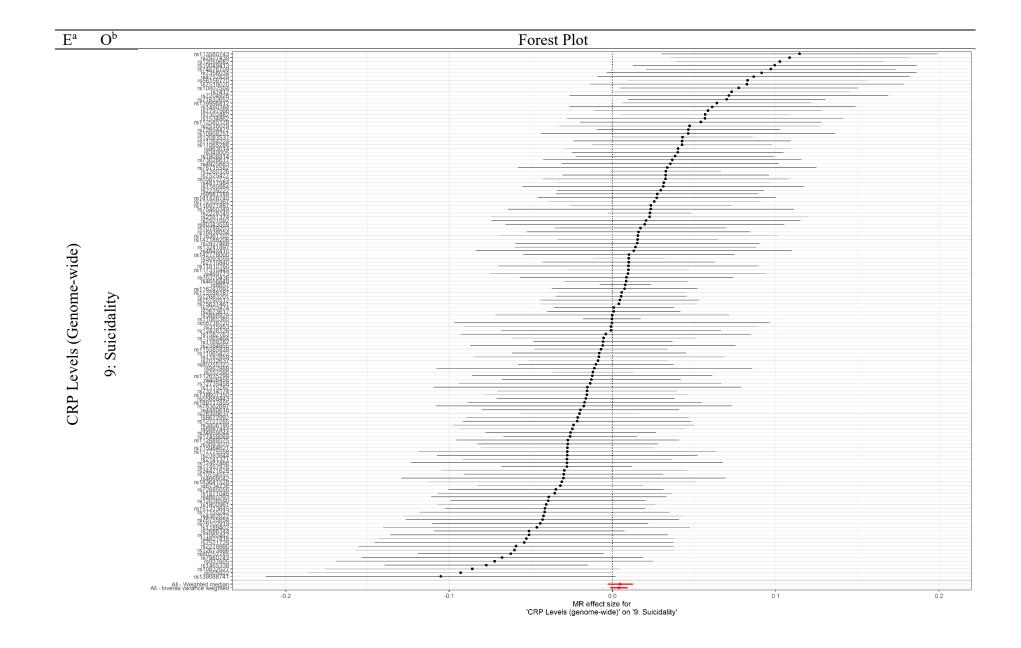


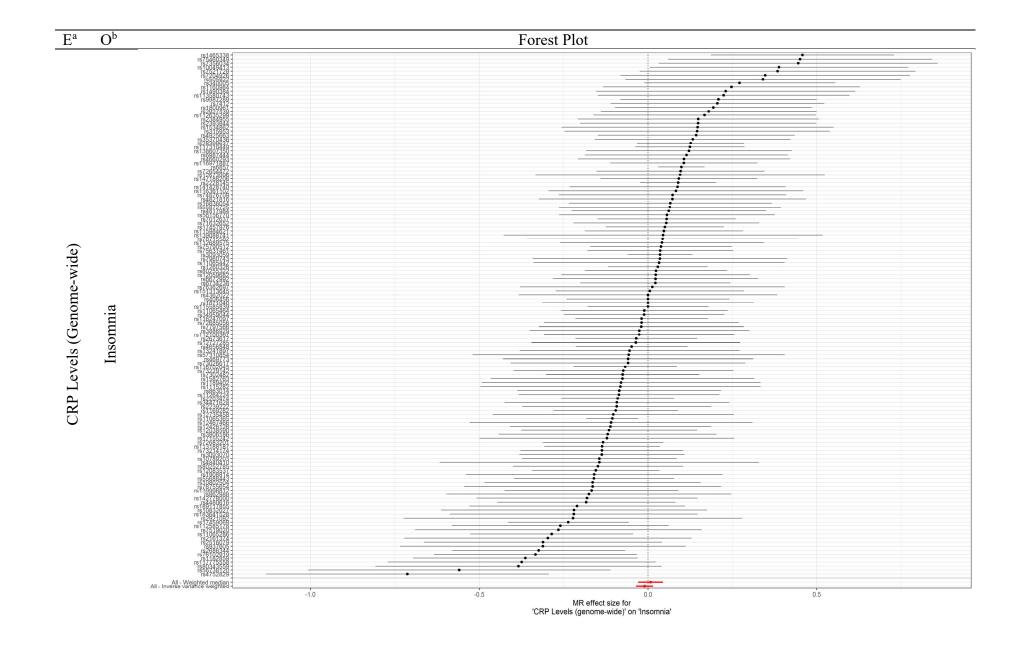


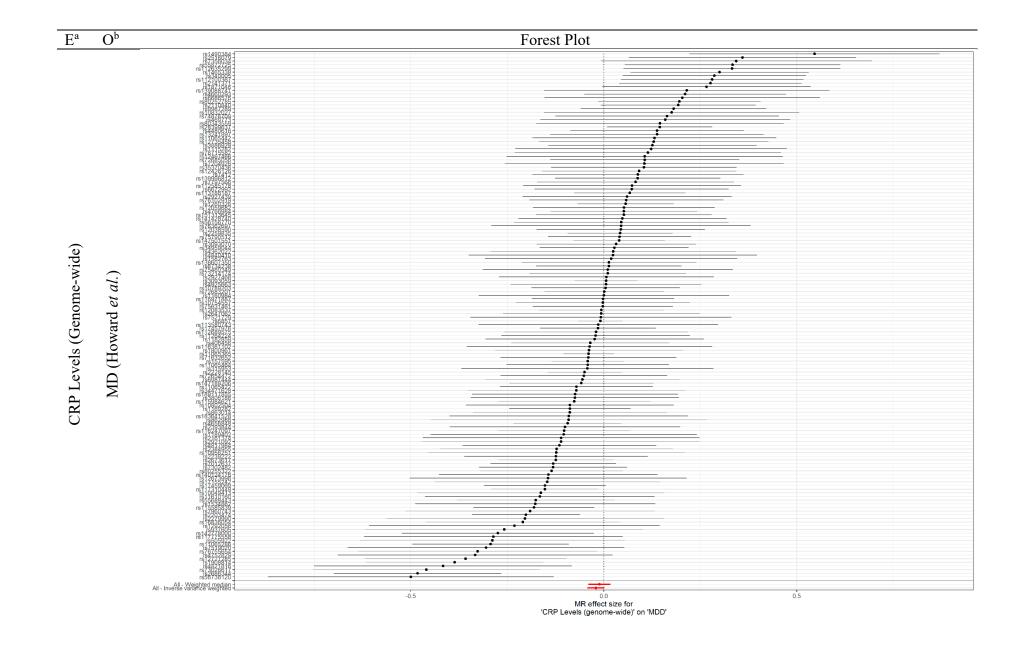


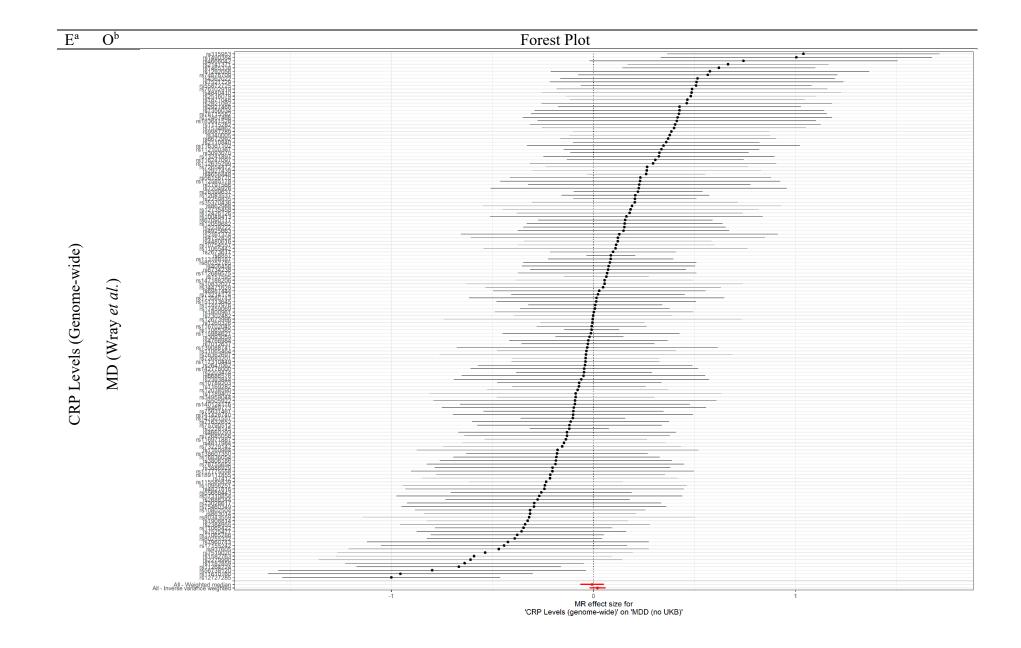


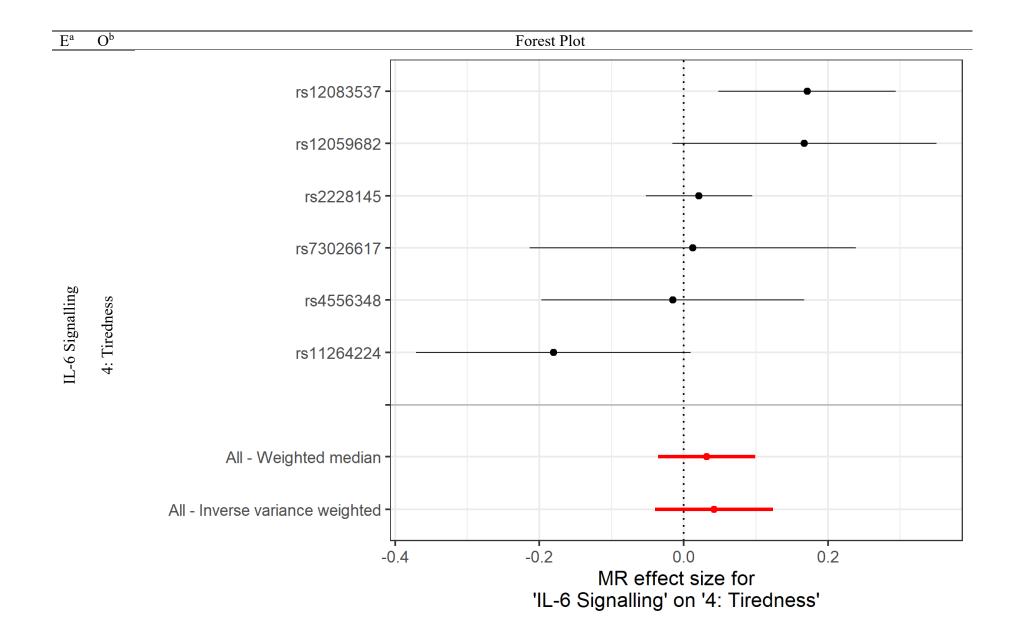


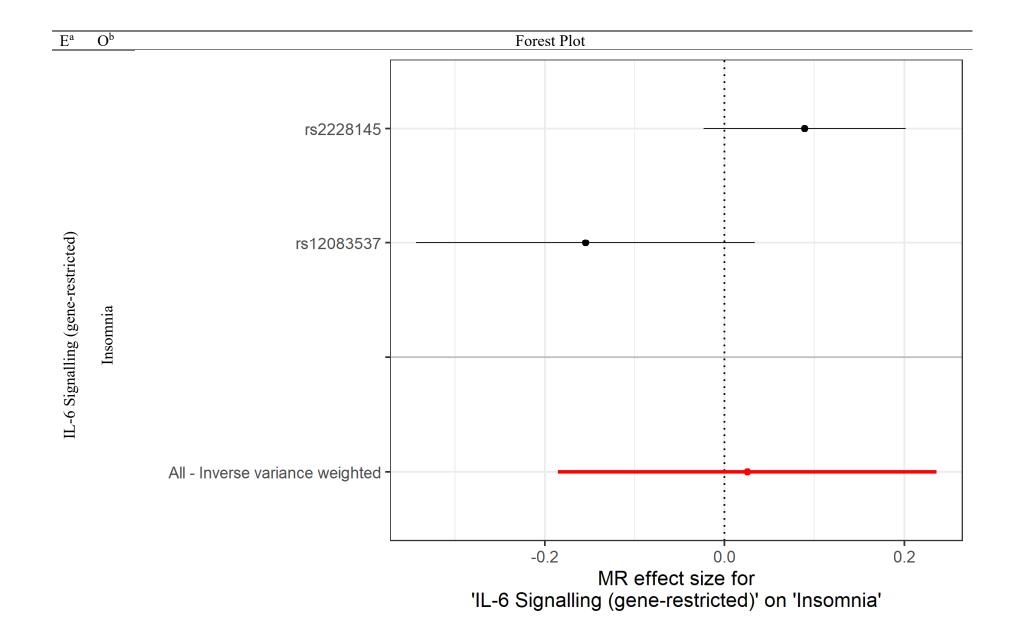


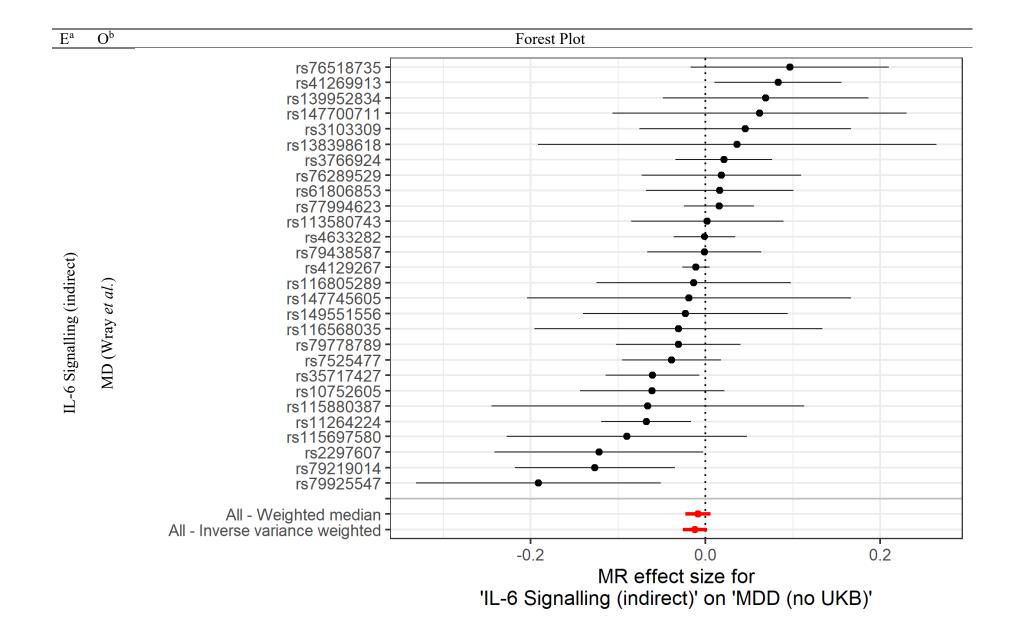


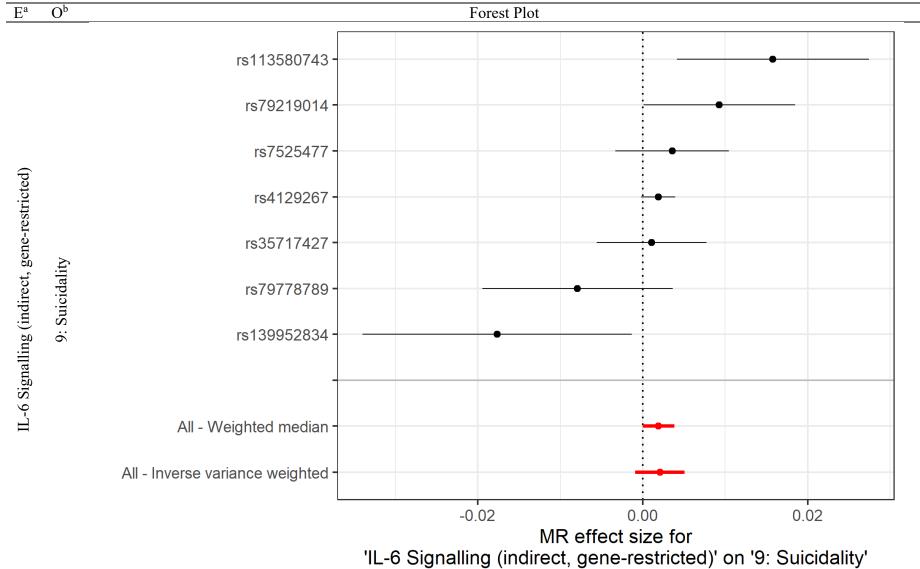












Note: ^aE=Exposure. ^bO=Outcome.

eTable 20. Functional Description of SNPs from Heterogeneous MR Exposure-Outcome Associations with Significant (P<0.001) Associations on the Outcome

		Top Brain eQTL				Top PheWAS Hit			MR Estimates ^b					
Chr	SNP	Gene	Incr. Allele	P	Trait ^a	Incr. Allel e	P	Outcome	A1 b	A2 b	Beta (SE) ^b	P		
_	<u>Instrument</u>													
10	rs11191560	ARL3	С	7.1e	Systolic blood pressure, automated reading	Т	2.5e ⁻⁴⁰	Insomnia	T	С	1.120 (0.311)	3.19e ⁻⁴		
								MD (Howard <i>et al.</i>)			1.218 (0.256)	2.07e ⁻⁶		
16	rs12446632	KNOP1	A	1.8e	Comparative body size at age 10	G	3e ⁻⁵⁰	3: Sleep problems	A	G	0.498 (0.131)	1.40e ⁻⁴		
								Insomnia			0.637 (0.18)	3.99e ⁻⁴		
15	rs16951275	SKOR1	Т	4.0e	Comparative body size at age 10	T	4e ⁻³⁷	Insomnia	С	T	-0.650 (0.196)	8.95e ⁻⁴		
19	rs17724992	-	-	-	Arm fat percentage (right)	A	6.8e ⁻¹⁶	MD (Howard et al.)	A	G	0.881 (0.258)	6.26e ⁻⁴		
5	rs2112347	ANKDD1 B	T	1.6e	Weight	T	-	Insomnia	G	T	0.721 (0.203)	3.89e ⁻⁴		
3	rs2365389	-	-	-	Comparative body size at age 10	С	8.6e ⁻¹⁸	MD (Howard et al.)	С	T	-1.180 (0.22)	8.17e ⁻⁸		
1	rs2820292	LMOD1	A	6.6e	Weight	С	8.1e ⁻¹⁹	1: Anhedoni a	A	С	-0.443 (0.121)	2.43e ⁻⁴		

								3: Sleep problems			-0.898 (0.191)	2.58e ⁻⁶
								4: Tiredness			-0.705 (0.172)	4.34e ⁻⁵
								Insomnia			-1.267 (0.263)	1.53e ⁻⁶
1	rs3101336	RPL31P12	T	6.7e -47	Comparative body size at age 10	С	6e ⁻	MD (Howard et al.)	T	С	-1.135 (0.132)	7.08e ⁻
								MD (Wray et al.)			-1.431 (0.272)	1.49e ⁻⁷
15	rs3736485	SCG3	G	3.0e	Waist circumferenc e	A	1e ⁻¹²	MD (Howard et al.)	A	G	0.812 (0.244)	8.82e ⁻⁴
2	rs4671328	-	-	-	Body mass index (BMI)	T	1.4e ⁻²⁶	Insomnia	T	G	-1.044 (0.241)	1.52e ⁻⁵
<u>CRP</u>	Levels (Genon	ne-Wide) Instr	ument									
1	rs12727285	-	-	-	Age first had sexual intercourse	A	1.2e	MD (Wray et al.)	A	С	-1.000 (0.275)	2.76e ⁻⁴
16	rs1465338	-	-	-	Heel quantitative ultrasound index (QUI), direct entry	С	2.4e ⁻¹⁵	Insomnia	С	T	0.457 (0.138)	9.48e ⁻⁴
6	rs1490384	-	-	-	Standing height	T	1.6e ⁻¹⁴⁰	MD (Howard et al.)	С	T	0.546 (0.165)	9.59e ⁻⁴
8	rs1908814	FAM66A	A	2.7e -12	Heel Broadband ultrasound attenuation,	A	1.3e ⁻³⁹	MD (Howard et al.)	A	С	-0.387 (0.117)	9.83e ⁻⁴

					direct entry							
12	rs2686344	-	-	-	Types of transport used (excluding work): Car/motor vehicle	С	3.0e ⁻⁶	MD (Howard et al.)	С	Т	-0.483 (0.111)	1.34e ⁻⁵
11	rs4752829	PSMC3	G	1.4e	Standing height	A	3e ⁻³⁹	Insomnia	G	A	-0.713 (0.214)	8.44e ⁻⁴
16	rs55872725	-	-	-	Body mass index (BMI)	T	-290	.3e 5: Changes in appetite	T	С	0.410 (0.084)	1.11e ⁻⁶

Note: Top Brain eQTL was obtained from GTEx, top Phenome-wide Association Study (PheWAS) hit in UK Biobank traits was obtained from the MR Base PheWAS platform (http://phewas.mrbase.org/), and MR estimates reflect single SNP MR analysis estimates using the Wald ratio. ^{26,37} ^aThe trait-increasing allele was coded based on effect allele and valence of beta estimate (i.e., if beta estimate was negative, the reference allele was indicated here). ^bMR estimates were provided, so that A1 reflects the exposure-increasing allele (i.e., if A2 was the exposure-increasing allele, the MR estimate was inversed).

eDiscussion. Supplemental Discussion

Inflammation and MD

We found evidence of genetic correlations between CRP levels and MD, similar in size to previous work, but could not replicate prior findings of MR associations of CRP levels or IL-6 signalling with MD.²⁹ There are two prior MR studies of inflammation and depression. First, a one-sample MR study by Wium-Andersen et al. 40 assessed associations between CRP levels and MD using a Danish sample of 78,809 individuals (1183 cases with hospitalisation for MD) and found decreased risk of MD with odds ratio (OR) of 0.79 (95% CI: 0.51-1.22; scaled to a doubling of CRP levels). Second, a two-sample MR study by Khandaker et al.²⁹ was based on 367,703 unrelated middle-aged participants of European ancestry from the UK Biobank cohort including 14,701 cases of probable lifetime major depression (moderate/severe). The study tested MR associations using genetic instruments for CRP levels (N=194,418)⁴¹ and for IL-6 activity (N=4,462-4,472)⁴². Importantly, MD definition by Khandaker et al. was based on self-reported moderate or severe depression, so 'falls in between' MD definitions used in GWAS studies by Howard et al. (both MD and broadly defined depression) and Wray et al. (MD only) in terms of certainty of MD diagnosis. ^{6,7,10} Results by Khandaker et al. showed that CRP levels increased MD risk with OR of 1.18 (95% CI: 1.07-1.29; scaled to 1-unit increase in log-transformed CRP levels in mg/L). Contrary to these results, our analyses show that 1-unit increase in logtransformed CRP levels was associated with risk of depression with OR=0.97 (95% CI: 0.94-1.00) and OR=0.98 (95% CI: 0.92-1.04), using MD definitions as per Howard et al. and Wray et al., respectively.

In terms of similarities, SNP selection in previous work and our study were both based on SNPs located in/ around respective *CRP* and *IL-6R* genes, so can be defined as *cis*-MR instruments.

Our analyses have three major differences from the previous MR investigations, however. First, we included larger sample sizes for GWAS of both exposure and outcome phenotypes (note that Wium-Andersen *et al.*⁴⁰ conducted single-sample MR). Second, we used a larger number of instruments for MR analyses and our genetic instruments were characterised with large F-values highlighting their strength (cf. eTables 4-5). As a result, our MR findings for the inflammation-MD association are likely more precise than that from the previous studies from a statistical perspective. Third, we defined IL-6 instruments based on downstream CRP levels and soluble IL-6Rs. Definition of IL-6 instruments based on IL-6 plasma levels can be argued to be preferable to our approach reflecting a more direct measurement approach. In contrast, IL-6 biology, ^{18,43–45} and in particular the dependency of downstream pro-inflammatory IL-6 effects on the amount of membrane-bound versus soluble IL-6Rs, could mean we selected a 'purer' index of IL-6-associated inflammatory activity as genetic proxy. Both approaches are valuable and can potentially compliment each other to provide a comprehensive overview on IL-6 associations with MD.

In sum, our findings question the robustness of CRP and IL-6 associations with MD, so we hope that future MR investigations will add further to the currently mixed evidence base.

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