

# **Original Article**

# Insulin resistance and poorer treatment outcomes in depression: evidence from UK Biobank primary care data

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## **Background**

Major depressive disorder (MDD) and insulin resistance-related conditions are major contributors to global disability. Their co-occurrence complicates clinical outcomes, increasing mortality and symptom severity.

#### Aims

In this study, we investigated the association of insulin resistance-related conditions and related polygenic scores (PGSs) with MDD clinical profile and treatment outcomes, using primary care records from UK Biobank.

#### Method

We identified MDD cases and insulin resistance-related conditions, as well as measures of depression treatment outcomes (e.g. resistance) from the records. Clinical-demographic variables were derived from self-reports, and insulin resistance-related PGSs were calculated using PRS-CS. Univariable analyses were conducted to compare sociodemographic and clinical variables of MDD cases with (IR+) and without (IR-) lifetime insulin resistance-related conditions. Multiple regressions were performed to identify factors, including insulin resistance-related PGSs, potentially associated with treatment outcomes, adjusting for confounders.

# **Results**

Among 30 919 MDD cases, 51.95% were IR+. These had more antidepressant prescriptions and classes utilisation and longer treatment duration than patients without insulin resistance-related conditions (P < 0.001). IR+ participants showed distinctive depressive profiles, characterised by concentration

issues, loneliness and inadequacy feelings, which varied according to the timing of MDD diagnosis relative to insulin resistance-related conditions. After adjusting for confounders, insulin resistance-related conditions (i.e. cardiovascular diseases, hypertension, non-alcoholic fatty liver disease, obesity/overweight, prediabetes and type 2 diabetes mellitus) were associated with antidepressant non-response/resistance and longer treatment duration, particularly when MDD preceded insulin resistance-related conditions. No significant PGS associations were found with antidepressant treatment outcomes.

#### Conclusions

Our findings support an integrated treatment approach, prioritising both psychiatric and metabolic health, and public health strategies aimed at early intervention and prevention of insulin resistance in MDD.

# Keywords

Treatment-resistant depression (TRD); coronary artery disease (CAD); selective serotonin reuptake inhibitors (SSRI); multi-morbidity; electronic health care records (EHR).

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Major depressive disorder (MDD) and insulin resistance-related conditions rank among the leading causes of disability worldwide, and their incidence continues to grow to epidemic proportions. Insulin resistance, which is characterised by diminished cellular response to insulin in muscles, fat and liver, is a common feature underlying cardiometabolic conditions such as type 2 diabetes mellitus (T2DM), obesity, dyslipidaemia and cardiovascular diseases (CVDs). These conditions are increasingly recognised as significant risk factors for psychiatric disorders, notably MDD.

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The epidemiological link between MDD and insulin resistance-related conditions is well established.<sup>4,5</sup> The risk for insulin resistance-related conditions is higher among patients with MDD and, in turn, people with T2DM and obesity have up to fourfold higher risk for MDD.<sup>3</sup> Comorbidity with insulin resistance-related conditions in individuals with MDD adversely affects the clinical trajectory of depression, resulting in increased severity, greater chronicity, and higher mortality rates.<sup>3,6</sup>

Recent studies have identified shared genetics and pathophysiological mechanisms between insulin resistance and MDD, including dysregulation of the hypothalamic–pituitary–adrenal (HPA) axis, chronic low-grade inflammation and alterations in the gut microbiota and neurotransmitter systems, suggesting a bidirectional relationship where each condition may influence the onset of the other. In MDD, chronic stress induces HPA axis hyperactivation, resulting in sustained cortisol elevation that promotes gluconeogenesis, impairs insulin-mediated glucose uptake in peripheral tissues and elevates circulating free fatty acids, thereby contributing to insulin resistance. Concurrently, MDD-associated inflammation can disrupt insulin receptor

signalling and contribute to metabolic dysfunction.<sup>3,8</sup> On the other hand, insulin resistance within the central nervous system impairs synaptic plasticity and affects mood-regulating neuro-transmitter systems.<sup>3,8</sup> These shared pathophysiological mechanisms have also been linked to resistance to treatments.<sup>9,10</sup> The first exploration of insulin's effects in psychiatric disorders was unfortunately linked to insulin shock therapy, introduced in the mid-20th century as a treatment for severe psychiatric conditions; this approach was abandoned by the 1970s, due to the lack of therapeutic rationale and risks of prolonged hypoglycaemia and other side-effects.<sup>11</sup> As discussed above, in recent years the study of insulin resistance in psychiatric disorders has been based on solid scientific evidence coming from both epidemiological and neurobiological studies.

Traditional antidepressant drugs are a cornerstone of MDD management; they address imbalances of distinct neurotransmitter systems but display inconsistent treatment efficacy. Around 60% of treated individuals, in fact, do not reach complete clinical remission after a full course of treatment. 12 This variability in response is partly attributed to the high clinical and pathophysiological heterogeneity of MDD, which is not restricted to monoamine system abnormalities; <sup>13</sup> one of the most studied MDD subgroups is characterised by metabolic disturbances, and it has been named immune-metabolic depression.<sup>14</sup> The presence of insulin resistance-related conditions in patients with MDD results in significant clinical challenges. The altered inflammatory and endocrine profile in these patients might reduce the effectiveness of standard antidepressant therapies, contributing to treatmentresistant depression (TRD).<sup>10</sup> Therefore, understanding the influence of insulin resistance and related conditions on antidepressant response is essential for developing personalised treatment strategies, which is a key goal in precision psychiatry. 15 Some antidepressants, such as monoamine oxidase inhibitors (MAOIs) and tricyclic antidepressants (TCAs), may exacerbate metabolic disturbances, further complicating treatment.<sup>6</sup> This necessitates a careful balancing, to weight the expected benefits on mental health against the potential metabolic risks.

Genomic studies have highlighted the role of genetic predisposition in the development of both MDD and insulin resistance, hinting at their shared genetic aetiology. Polygenic scores (PGSs) quantify the cumulative effect of genetic variants associated with a particular trait or disease; they represent a promising approach for studying the clinical/genetic heterogeneity and treatment response in depression, heralding personalised medicine approaches based on individual genetic profiles.

Despite growing evidence supporting a link between insulin resistance and MDD, there is still a paucity of large-scale studies comprehensively exploring the association between insulin resistance-related conditions and treatment outcomes in MDD. 16,17 In particular, the temporal relationship between the onset of insulin resistance-related conditions and MDD, and how this sequence influences the clinical course of MDD and response to treatment, are not well understood. This gap in knowledge hinders possible considerations for the development of more well -tolerated and effective treatment strategies for patients with MDD and comorbid insulin resistance-related conditions.

The present study investigated whether insulin resistance-related conditions and their PGSs are associated with the clinical course of MDD or response to antidepressant treatment, considering also which condition was diagnosed earlier. This study leveraged data from the UK Biobank (UKB) cohort linked to primary care records, providing the opportunity to examine these relationships in a large population cohort.

#### Method

# UKB cohort and linked primary care data

This study utilised data from the UKB, which is a large-scale, prospective cohort study providing extensive genetic, lifestyle and health data from approximately 500 000 individuals across the UK, aged between 40 and 69 years at recruitment (2006–2010). Primary care data were available for ~45% of the cohort (230 096 participants), reflecting regional and provider variability. Missing or incomplete data were not imputed.

The UKB includes genotypes for 488 377 participants, who were genotyped using the Applied Biosystems UK BiLEVE and UKB Axiom Arrays (Thermo Fisher Scientific, Inc., Waltham, MA, USA). Detailed methodologies for DNA extraction, genotyping, quality control and imputation in UKB are reported elsewhere.

As part of the UKB's comprehensive data collection, primary care data were obtained for 230 096 participants, forming the basis of our study. 19 This subset includes electronic health records (EHRs) sourced from English, Scottish and Welsh general practitioner practices, using various primary care information systems (EMIS, Vision, TPP). These records include dates and codes for primary care clinical events (e.g. consultations, diagnoses, referrals to specialists or prescription events) coded using Read version 2 (V2) and Clinical Terms Version 3 (CTV3 or V3), the British National Formulary (BNF) and/or the Dictionary of Medicines and Devices (dm+d).<sup>19</sup> These codes were used to identify MDD and insulin resistance-related conditions, the time at first diagnosis and antidepressant prescriptions. In cases where prescription or diagnosis dates were missing or implausible (e.g. 01/01/1901, 07/07/2037), diagnostic codes were excluded from temporal analyses but retained for non-temporal analyses to maximise sample size, and prescription records were not considered for derivation of treatment outcome variables. Potential biases arising from missing or incomplete primary care data are addressed in the Discussion.

## **Ethics statement**

The authors assert that all procedures contributing to this work comply with the ethical standards of the relevant national and institutional committees on human experimentation, and with the Helsinki Declaration of 1975 as revised in 2013. All procedures involving human subjects/patients were approved by the Northwest Multi-centre Research Ethics Committee (MREC), approval no. 11/NW/0382.

# Target population: MDD cases with or without insulin resistance-related conditions

We focused on a subset of UKB participants having at least one diagnostic record for a unipolar depressive disorder and at least one prescription code for an antidepressant medication, excluding those with bipolar, psychotic or substance use disorders. These data were extracted according to the steps described in a previous work.<sup>20</sup>

Similarly, insulin resistance-related conditions were defined based on diagnostic records. We considered the presence of at least one primary care Read code for coronary artery disease (CAD), cerebral ischaemia, CVDs, dyslipidaemia, polycystic ovary syndrome (PCOS), familiar dyslipidaemia, gestational diabetes, hypertension, non-alcoholic fatty liver disease (NAFLD), obesity/overweight, T2DM and Cushing's disease. Read V2 and CTV3 codes used for the extraction of insulin resistance-related conditions are reported in Supplementary Tables 1 and 2. These

IR-related conditions were selected based on their established contribution to, or pathogenic association with, metabolic dysregulations commonly seen in IR.<sup>2,21,22</sup>

#### **Outcomes of interest**

The outcomes of interest were: (a) antidepressant non-response, defined as  $\geq 1$  switch between different antidepressant drugs, with each drug prescribed for at least 6 consecutive weeks, to avoid drug switches due to side-effects; we considered a time interval between consecutive prescriptions of no more than 14 weeks to ensure that treatment had not been suspended, following another recent study;<sup>20</sup> (b) TRD, defined as  $\geq 2$  switches between different antidepressant drugs, with each drug prescribed for at least 6 consecutive weeks, to ensure an adequate duration of treatment before switching, and a time interval between prescriptions >14 weeks;<sup>20</sup> and (c) overall treatment time, used as a proxy for MDD chronicity and calculated as the sum of time windows between 2 consecutive antidepressant prescriptions (if the time interval between 2 consecutive prescriptions was >14 weeks, otherwise it was considered a time window free from antidepressants).

## **PGS** computation

PGSs were estimated in the UKB using PRS-CS-auto, a Bayesian method that applies continuous shrinkage priors on single-nucleotide polymorphism (SNP) effect size, bypassing the need to preselect a Genome-Wide Association Study (GWAS) *P*-threshold for SNP inclusion.<sup>23</sup> GWAS summary statistics used for the construction of PGSs were those for body mass index (BMI), CAD, T2DM, fasting plasma glucose (FPG), glucose levels 2 h following oral glucose challenge (2hGlu), glycated haemoglobin (HbA1c), high-density lipoproteins (HDL), homeostatic model assessment of insulin resistance, low-density lipoproteins (LDL) and triglycerides (TGL). GWAS summary statistics were selected based on the largest GWAS sample size available, excluding UKB, to avoid sample overlap between input and target samples (Supplementary Table 3).

# Statistical analysis

We compared individuals with MDD having or not having insulin resistance-related comorbidities, while also considering stratification of individuals based on the temporal sequence of MDD-first diagnosis relative to insulin resistance-related condition-first diagnosis, according to primary care records.

Univariable analyses were conducted using two-sample Student's t-test and Pearson's  $\chi^2$  test, as appropriate, to examine differences in demographic, socioeconomic, clinical and lifestyle factors among individuals affected by MDD with and without insulin resistance-related conditions. The variables assessed included the age at MDD onset, follow-up duration, mean age during follow-up, patterns of antidepressant prescription, psychological symptoms and treatment outcomes (see Supplementary Table 4 for information on variables and their coding). A subsequent one-way analysis of variance (ANOVA) was used to compare these variables across three defined groups of individuals: MDD without insulin resistance-related conditions (IR-), MDD following diagnosis of an insulin resistance-related condition (MDD-after-IR) and MDD diagnosis preceding insulin resistance-related conditions (MDD-before-IR). Post hoc analyses, employing Tukey's honestly significant difference (HSD) test, were conducted to identify differences between group pairs.

To examine the association of insulin resistance-related conditions and their PGSs with treatment outcomes, we used either multivariable linear or logistic regression models. These analyses were adjusted for assessment centre, mean age during follow-up, follow-up duration, sex, smoking status, Townsend Deprivation Index and population principal components (the latter only for PGS analyses). PGS analyses were carried out for European individuals only (identified as in Fabbri et al<sup>20</sup>).

We quantified the variance explained in treatment non-response or resistance using Nagelkerke's pseudo- $R^2$ . For models with overall treatment time as a continuous outcome, variance was quantified using  $R^2$ . The Hosmer–Lemeshow  $\chi^2$  test was employed to evaluate the goodness of fit of logistic regression models, with  $P \geq 0.05$  indicating no significant difference between observed and predicted values, suggesting an adequate model fit. While pseudo- $R^2$  in this study was anticipated to be low due to the multifactorial nature of depression treatment outcomes and insulin resistance-related traits, goodness-of-fit metrics of the Hosmer–Lemeshow test can ensure that the predictions are reliable within the observed data.

This study was hypothesis driven, building on prior evidence and well established biological links between MDD and insulin resistance-related conditions. Although not preregistered, both the analysis plan and selection of variables analysed were informed by previous literature. <sup>3,20,24</sup> To minimise the risk of type I errors due to multiple testing, a stringent Bonferroni correction was applied ( $\alpha = 0.0006$ ), accounting for 27 predictors and 3 treatment outcomes.

All analyses were performed in R version 4.3.2 (2023-10-31) for Linux (R Foundation for Statistical Computing, Vienna, Austria; see <a href="https://cran.r-project.org/">https://cran.r-project.org/</a>), with data cleaning and manipulation streamlined by the R package tidyverse 2.0 for Linux (Posit, PBC, Boston, MA, USA; see <a href="https://tidyverse.tidyverse.org/">https://tidyverse.org/</a>).

# **Results**

# Sociodemographic characteristics of the sample

Our study included 30 919 individuals with MDD, of whom 16 063 (51.95%) had a lifetime history of insulin resistance-related conditions (Supplementary Table 5). The mean age during follow-up was 56.12 years (s.d. = 8.35), with males comprising 31.8% of the cohort. A predominant majority (n = 29 581, 95.67%) were of European descent. The most prevalent insulin resistance-related conditions included hypertension (n = 9499, 30.74%), obesity/overweight (n = 5243, 16.97%), CVDs (n = 3650, 11.81%), T2DM (n = 3092, 10.01%) and CAD (n = 2450, 7.92%) (Supplementary Table 5). Of the cohort, 6357 individuals (20.56%) received their first MDD diagnosis following an insulin resistance-related diagnosis; conversely, 9483 (30.67%) had MDD before any insulin resistance-related condition and 14 856 (48.05%) had no history of insulin resistance-related conditions (Supplementary Table 5).

Univariable analyses revealed significant sociodemographic differences among patients with MDD when stratified by the presence or absence of lifetime insulin resistance-related conditions (Table 1). Patients with lifetime insulin resistance-related conditions were older and more frequently male compared with those without (Table 1). The former also reported lower levels of education and lower socioeconomic status, as indicated by the Townsend Deprivation Index and household income (Table 1). Stratification by insulin resistance-related diagnosis timing relative to MDD onset confirmed these findings (Supplementary Tables 7 and 8).

# MDD clinical profile and insulin resistance

Individuals in the MDD IR+ group had a higher mean age at first diagnosis of depression and longer duration of follow-up (Table 1).

4

Table 1 Differences in sociodemographic and clinical characteristics between patients with major depressive disorder (MDD) not having a lifetime history of any insulin resistance (IR)-related condition (IR–) and those with MDD having a history of any IR-related condition (IR+). Student's two-sample t-tests and Pearson's χ² tests were used for continuous and categorical variables, as appropriate

| Variable                                                                | IR-                                                | IR+                                                            | Test statistic     | <i>P</i> -value          |
|-------------------------------------------------------------------------|----------------------------------------------------|----------------------------------------------------------------|--------------------|--------------------------|
| Alcohol intake frequency, N (%)                                         | Daily or almost daily, 2593 (0.16)                 | Daily or almost daily, 2502 (0.16)                             | $\chi^2 = 259.77$  | $5.10 \times 10^{-55}$   |
|                                                                         | Three or four times per week, 3107 (0.19)          | Three or four times per week, 2752 (0.17)                      |                    |                          |
|                                                                         | Once or twice per week, 3991 (0.25)                | Once or twice per week, 3875 (0.24)                            |                    |                          |
|                                                                         | One to three times per month/special occasions     | One to three times a month/special occasions only, 4943 (0.31) |                    |                          |
|                                                                         | only, 3896 (0.24)                                  | Never, 1941 (0.12)                                             |                    |                          |
|                                                                         | Never, 1236 (0.07)                                 |                                                                |                    |                          |
| Average household income (£), N (%)                                     | >52 000, 2751 (0.17)                               | >52 000, 1777 (0.11)                                           | $\chi^2 = 675.44$  | $4.45 \times 10^{-146}$  |
|                                                                         | 31 000-51 999, 3481 (0.22)                         | 31 000–51 999, 2775 (0.17)                                     |                    |                          |
|                                                                         | 18 000-30 999, 3283 (0.20)                         | 18 000–30 999, 3701 (0.23)                                     |                    |                          |
|                                                                         | <18 000, 3316 (0.21)                               | <18 000, 5080 (0.32)                                           |                    |                          |
| BMI (kg/m²), mean (s.d.)                                                | 26.21 (4.16)                                       | 30.15 (5.73)                                                   | t = -69.34         | $< 5.0 \times 10^{-324}$ |
| Age at first depression diagnosis (years), mean (s.d.)                  | 46.29 (11.13)                                      | 49.47 (11.91)                                                  | t = -24.27         | $6.19 \times 10^{-129}$  |
| Educational qualifications, N (%)                                       | College/university, 4603 (0.29)                    | College/university, 3554 (0.22)                                | $\chi^2 = 852.9$   | $2.66 \times 10^{-183}$  |
|                                                                         | A/AS-levels, 1821 (0.11)                           | A/AS-levels, 1530 (0.10)                                       |                    |                          |
|                                                                         | O-levels/GCSEs/CSEs, 4444 (0.28)                   | O-levels/GCSEs/CSEs, 4323 (0.27)                               |                    |                          |
|                                                                         | NVQ/HND/                                           | NVQ/HND/                                                       |                    |                          |
|                                                                         | HNC/other professional qualifications, 1631 (0.10) | HNC/other professional qualifications, 2151 (0.13)             |                    |                          |
|                                                                         | None of the above, 2192 (0.14)                     | None of the above, 4254 (0.26)                                 |                    |                          |
| Ever had SARI prescription, prop. yes/no                                | 0.06/0.94                                          | 0.07/0.93                                                      | $\chi^2 = 21.215$  | $4.11 \times 10^{-6}$    |
| Ever had SNRI prescription, prop. yes/no                                | 0.13/0.87                                          | 0.15/0.85                                                      | $\chi^2 = 32.455$  | $1.22 \times 10^{-8}$    |
| Ever had SSRI prescription, prop. yes/no                                | 0.86/0.14                                          | 0.84/0.16                                                      | $\chi^2 = 27.322$  | $1.72 \times 10^{-7}$    |
| Ever had TCA prescription, prop. yes/no                                 | 0.5/0.5                                            | 0.58/0.42                                                      | $\chi^2 = 207.327$ | $5.26 \times 10^{-47}$   |
| Ever had tetracyclic antidepressant prescription, prop. yes/no          | 0.13/0.87                                          | 0.16/0.84                                                      | $\chi^2 = 34.637$  | $3.97 \times 10^{-9}$    |
| Fed-up feelings, prop. yes/no                                           | 0.64/0.36                                          | 0.67/0.33                                                      | $\chi^2 = 22.973$  | $1.64 \times 10^{-6}$    |
| Follow-up duration (years), mean (s.d.)                                 | 38.34 (13.11)                                      | 40.85 (13.79)                                                  | t = -16.37         | $5.22 \times 10^{-60}$   |
| Loneliness, prop. yes/no                                                | 0.35/0.65                                          | 0.38/0.62                                                      | $\chi^2 = 24.745$  | $6.54 \times 10^{-7}$    |
| Long-standing illness, disability or infirmity, prop. yes/no            | 0.35/0.65                                          | 0.56/0.44                                                      | $\chi^2 = 1339.24$ | $3.36 \times 10^{-293}$  |
| Mean age during follow-up (years), mean (s.d.)                          | 53.54 (8.21)                                       | 58.51 (7.74)                                                   | t = -54.57         | $< 5 \times 10^{-324}$   |
| No. of antidepressant classes ever used, mean (s.d.)                    | 1.71 (0.88)                                        | 1.84 (0.95)                                                    | t = -12.01         | $3.64 \times 10^{-33}$   |
| No. of antidepressant prescription records, mean (s.d.)                 | 41.86 (59.28)                                      | 56.24 (71.64)                                                  | t = -19.29         | $1.94 \times 10^{-82}$   |
| No. of antidepressant prescription records/follow-up years, mean (s.d.) | 1.26 (1.92)                                        | 1.59 (2.3)                                                     | t = -14.05         | $1.05 \times 10^{-44}$   |
| No. of antidepressant switches, mean (s.d.)                             | 1.77 (2.36)                                        | 2.07 (2.66)                                                    | t = -10.49         | $1.06 \times 10^{-25}$   |
| No. of days/week of moderate physical activity, mean (s.d.)             | 3.6 (2.37)                                         | 3.45 (2.43)                                                    | t = 5.2            | $1.99 \times 10^{-7}$    |
| No. of depression diagnostic records/follow-up years, mean (s.d.)       | 0.11 (0.23)                                        | 0.1 (0.16)                                                     | t = 6.46           | $1.08 \times 10^{-10}$   |
| No. of SNRI prescriptions, mean (s.d.)                                  | 3.4 (21.44)                                        | 4.8 (23.99)                                                    | t = -5.43          | $5.61 \times 10^{-8}$    |
| No. of SSRI prescriptions, mean (s.d.)                                  | 26.41 (39.23)                                      | 31.82 (46.19)                                                  | t = -11.13         | $9.79 \times 10^{-29}$   |
| No. of TCA prescriptions, mean (s.d.)                                   | 8.79 (26.29)                                       | 14.69 (37.47)                                                  | t = -16.12         | $3.08 \times 10^{-58}$   |
| No. of tetracyclic antidepressant prescriptions, mean (s.d.)            | 1.91 (12.79)                                       | 3.07 (16.21)                                                   | t = -7.01          | $2.40 \times 10^{-12}$   |
| Overall treatment time (weeks), mean (s.d.)                             | 184.05 (229.77)                                    | 235.98 (262.19)                                                | t = -18.55         | $1.97 \times 10^{-76}$   |
| Recent trouble concentrating on things, prop. yes/no                    | 0.36/0.64                                          | 0.4/0.6                                                        | $\chi^2 = 11.784$  | $5.97 \times 10^{-4}$    |
| Sex (M/F, prop.)                                                        | 0.26/0.74                                          | 0.37/0.63                                                      | $\chi^2 = 393.075$ | $1.77 \times 10^{-87}$   |
| Smoking status, prop. yes/no                                            | 0.47/0.53                                          | 0.53/0.47                                                      | $\chi^2 = 94.106$  | $2.99 \times 10^{-22}$   |
| Townsend Deprivation Index, mean (s.d.)                                 | -1.27 (3.03)                                       | -0.74 (3.23)                                                   | t = -14.79         | $2.46 \times 10^{-49}$   |
| Treatment non-response, prop. yes/no                                    | 0.2/0.8                                            | 0.25/0.75                                                      | $\chi^2 = 98.393$  | $3.43 \times 10^{-23}$   |
| Treatment resistance, prop. yes/no                                      | 0.08/0.92                                          | 0.12/0.88                                                      | $\chi^2 = 104.245$ | $1.79 \times 10^{-24}$   |

Only statistically significant differences following Bonferroni correction are reported; non-significant differences are detailed in Supplementary Table 6.

Prop., proportion; BMI, body mass index; SARI, serotonin antagonist and reuptake inhibitor; SNRI, serotonin-norepinephrine reuptake inhibitor; SSRI, selective serotonin reuptake inhibitor; TCA, tricyclic antidepressant. UK educational qualifications include: College/university degree, which covers undergraduate (Bachelor's degrees) and postgraduate degrees (Master's and Doctoral degrees); A/AS levels (Advanced/Advanced Subsidiary levels), qualifications typically pursued by students aged 16 to 18 as a preparatory step for university or vocational training; GCSEs (General Certificate of Secondary Education), the primary levels) and CSEs (General Certificate of Secondary Education, a non-academic track phased out in 1988 alongside O-levels); NVQ (National Vocational Qualifications), HND (Higher National Diploma) and HNC (Higher National Certificate), which are vocational qualifications offered post-secondary education to provide practical skills and training in various fields.

This group exhibited more frequently characteristics suggestive of an unhealthy lifestyle, including higher rates of smoking and lower levels of moderate physical activity, but also lower alcohol intake frequency compared with the IR— group (Table 1). The IR+ group also showed higher prevalence of long-term illnesses and disability, as well as higher BMI (Table 1). BMI was highest in the MDD-after-IR group, followed by the MDD-before-IR group (Supplementary Table 9).

Depressive symptoms and traits also varied between groups. The IR+ group reported more feelings of loneliness and being fedup, but reduced rumination over embarrassing situations, the latter especially in the MDD-after-IR group (Table 1 and Supplementary Tables 7 and 8). Patients in the IR+ MDD-after-IR subgroup were characterised by reduced feelings of nervousness, worry/anxiety, guilt and sensitivity to hurt, but increased feelings of inadequacy and concentration difficulties when compared with IR- individuals (Supplementary Table 8). In contrast, those with pre-existing MDD exhibited higher levels of neuroticism compared with IR- individuals (Supplementary Table 7).

## **Prescription patterns**

IR+ individuals had a higher rate of antidepressant prescriptions per follow-up year, used more drug classes and had more frequent antidepressant switches than those without any lifetime insulin resistance-related condition (Table 1). There were also differences in the prevalence of prescribed antidepressant classes between the groups. Specifically, individuals prescribed serotonin antagonist and reuptake inhibitors (SARIs, nefazodone and trazodone), serotonin-norepinephrine reuptake inhibitors (SNRIs, duloxetine and venlafaxine), tetracyclic antidepressants (mirtazapine) and TCAs were more numerous in the IR+ group, while the opposite was found for selective serotonin reuptake inhibitors (SSRIs); however, the number of prescriptions of individual antidepressants, including SSRIs, was higher in the IR+ group (Table 1). After stratifying the sample based on the timing of the first diagnosis of insulin resistance-related conditions in relation to the first MDD diagnosis, the higher antidepressant prescription level and use of more different antidepressant classes was particularly evident in individuals having MDD onset before insulin resistance-related conditions (Supplementary Tables 7 and 8). A higher number of antidepressant switches and prescriptions of SARIs and SNRIs was found in patients with MDD preceding insulin resistance-related diagnoses versus the IR- group, but not in those with later MDD diagnosis (Supplementary Tables 7 and 8). Among individuals diagnosed with MDD following, but not preceding, an insulin resistance-related condition, a higher proportion was prescribed SSRIs compared with IR- individuals (Supplementary Tables 7 and 8). No differences were observed in antipsychotic use as adjunct treatments or other antidepressant classes among the groups.

# **Treatment outcomes**

IR+ patients had overall longer treatment duration and poorer outcomes, including higher rates of TRD and non-response, than their IR- counterparts (Table 1). After adjusting for confounders, specific insulin resistance-related conditions (i.e. CVDs, CAD, hypertension, NAFLD, obesity/overweight, prediabetes and T2DM) were associated with increased odds of TRD and antidepressant non-response (Fig. 1(a) and (b) and Supplementary Table 10(a) and (b)). This pattern was consistent in both the overall sample and the subgroup of patients who developed MDD prior to each specific insulin resistance-related condition, but not in those who developed MDD after insulin resistance-related conditions (Supplementary Table 11). Regarding the chronicity of MDD, proxied by overall treatment time, a similar result was observed. The presence of insulin resistance-related conditions

was associated with longer overall treatment time in the entire sample (Fig. 1(c) and Supplementary Table 10(c)), especially in individuals diagnosed with MDD before the insulin resistance-related condition (Supplementary Table 11). Conversely, in patients who developed MDD following insulin resistance diagnosis, a general association of poorer treatment outcomes and overall treatment time with the presence of any insulin resistance-related condition, rather than with specific insulin resistance-related conditions, was observed (Supplementary Table 12).

We did not identify any association between the PGSs of insulin resistance-related diseases/traits and treatment outcomes or overall treatment time; we found nominal associations (P < 0.05) with the PGS of CAD, triglycerides and BMI in certain subgroups defined by diagnosis timing (Supplementary Tables 13–15). The  $R^2$ /Nagelkerke's pseudo- $R^2$  values for models predicting treatment outcomes ranged from 1.3 to 3.9%, reflecting the multifactorial nature of depression treatment outcomes and insulin resistance-related conditions. Despite this, the Hosmer–Lemeshow  $\chi^2$  test indicated an acceptable fit for most models (Supplementary Tables 10–15), supporting the validity of the observed associations.

# **Discussion**

# Overview of main findings

This study, leveraging primary care-linked data from UKB, investigated the associations between insulin resistance-related conditions and treatment outcomes, prescription patterns and clinical profiles of patients with MDD. Our analyses revealed a high prevalence of insulin resistance-related conditions among individuals with a history of MDD, emphasising the need to integrate metabolic health into psychiatric care. Those with insulin resistance-related comorbidities showed a later age at first MDD diagnosis, were less often female and exhibited more unhealthy lifestyle factors. Our study is the first to utilise a large, real-world primary care sample with EHRs and genetic information, demonstrating the increased complexity involved in managing depression in this population. This complexity is evidenced by a higher number of antidepressant prescriptions, switches and number of classes ever used among those with insulin resistancerelated comorbidities. Most notably, the presence of insulin resistance-related conditions was associated with a higher likelihood of TRD, antidepressant non-response and prolonged treatment duration, particularly when MDD preceded the onset of insulin resistance-related conditions.

# Prevalence of insulin resistance conditions in depression: mechanisms and unhealthy lifestyle

The high prevalence of hypertension, obesity/overweight, CVDs and T2DM within our MDD sample aligns with existing research, underscoring the influence of these comorbidities on mental health. A4,17,25 Metabolic dysregulation and MDD share overlapping pathophysiological mechanisms, including chronic inflammation, impaired insulin signalling, neuroendocrine dysfunction and oxidative stress (e.g. Milaneschi et all4). These disturbances contribute to depressive symptomatology by disrupting neural circuits related to reward, verbal/numerical reasoning and processing speed, thereby exacerbating core depressive symptoms such as anhedonia and cognitive dysfunction and hindering treatment response. Furthermore, behavioural and affective symptoms of depression may foster an unhealthy lifestyle, predisposing individuals to insulin resistance-related conditions. This underscores the necessity of integrated treatment approaches.

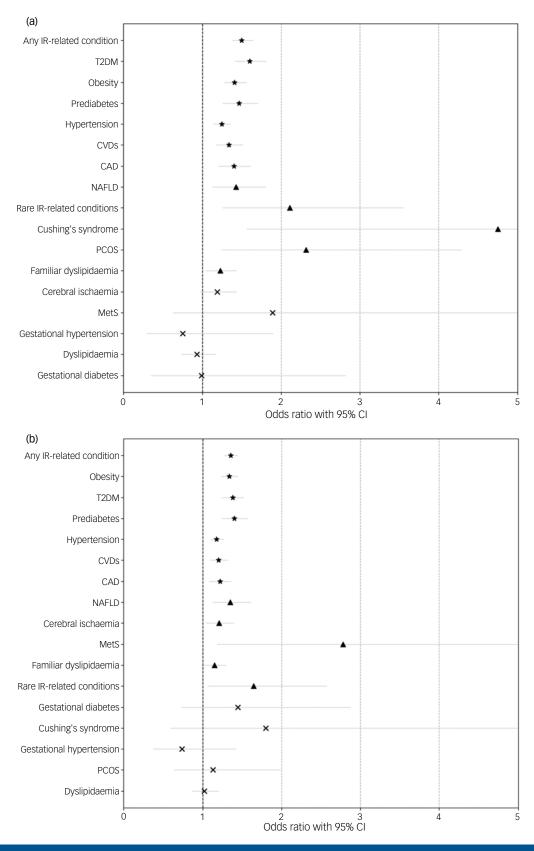


Fig. 1 Associations between insulin resistance (IR)-related conditions and treatment outcomes in major depressive disorder (MDD). These forest plots illustrate the associations of IR-related conditions with (a) treatment-resistant depression, (b) antidepressant non-response and (c) overall treatment time in patients with a lifetime history of MDD. Odds ratios (ORs), along with their 95% CIs, or betas and standard errors, are depicted for each IR-related condition for binary or continuous outcome, respectively. Statistical significance is represented using different symbols: stars ( $\star$ ) for statistically significant results (P < 0.0006), triangles ( $\star$ ) for nominally significant results (P < 0.05) and crosses ( $\star$ ) for non-significant results (P < 0.05). The findings are arranged in a gradient based on significance, with the most statistically significant results at the top and non-significant results at the bottom of the plot. CAD, coronary artery disease; CVDs, cardiovascular diseases; PCOS, polycystic ovary syndrome; MetS, metabolic syndrome; NAFLD, non-alcoholic fatty liver disease; T2DM, type 2 diabetes mellitus.

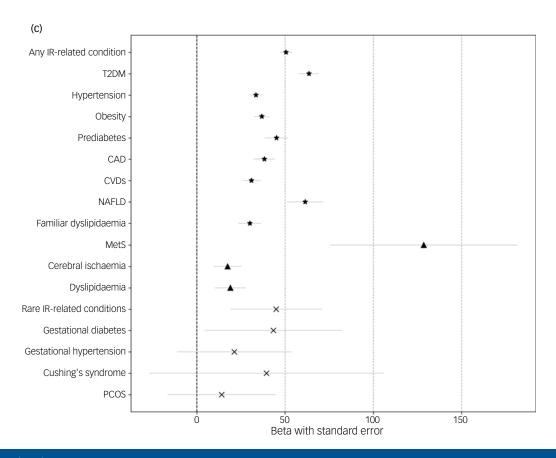


Fig. 1 (Continued).

The higher prevalence of unhealthy behaviours, such as smoking and reduced physical activity, in the IR+ group resonates with existing evidence linking lifestyle factors to both depression and metabolic disturbances.<sup>29</sup> This observation, coupled with the evidence indicating poorer treatment outcomes in the same group, highlights the potential benefits of incorporating lifestyle interventions in MDD management.<sup>29</sup> However, lower alcohol intake frequency was noted, which aligns with certain clinical characteristics of the IR+ group. Given the comorbidities and more complex medication regimens in this group, it is likely that they had prudently reduced alcohol intake for medical reasons (as a form of tertiary prevention and to avoid possible pharmacokinetic interactions with their medications<sup>30</sup>). The link between chronic health conditions, such as MDD and insulin resistance and lower socioeconomic status (SES), is probably bidirectional. The risk of chronic diseases is increased in groups with lower SES<sup>31</sup> but, at the same time, these conditions negatively impact well-being and social/work functioning, escalating medical expenses.<sup>32</sup>

# Distinct clinical and emotional profiles

Our study also suggests that individuals with a lifetime history of both MDD and insulin resistance-related conditions exhibit a distinct clinical profile of depression. The higher mean age at MDD first diagnosis in the IR+ group could possibly have resulted from an intersection of age-related reduction in insulin sensitivity, lifestyle and psychosocial stressors inherent to ageing, such as social isolation. Agerelated factors, including chronic health challenges, retirement and shifts in social roles, may contribute to the simultaneous emergence of depression and insulin resistance-related conditions.<sup>33</sup> The prevalent feelings of loneliness and being fed-up in the MDD IR+ group resonate with the heightened susceptibility to perceived social isolation associated with atypical depression.<sup>34</sup> This subtype of depression,

frequently connected with inflammatory and metabolic disturbances, may also be reflected in the elevated BMI observed in the same group, consistent with the weight gain characteristic of atypical depression.<sup>34</sup> The distinctive emotional profiles observed in relation to the timing of MDD onset versus insulin resistance-related diagnoses provide potential hints for targeted preventive interventions. Higher neuroticism in individuals with pre-existing MDD suggests that these patients might have personality characteristics that could predispose not only to depression but also to metabolic changes. Neuroticism, characterised by a tendency towards anxiety, depression and emotional instability, is a well established risk factor for developing both mood disorders and cardiometabolic conditions.<sup>35</sup> Conversely, the reduced presence of classical anxiety-related symptoms, coupled with increased feelings of inadequacy and difficulty concentrating in the MDD-after-IR subgroup, could reflect the negative psychological impact of experiencing a chronic cardiometabolic condition prior to depression. Living with a chronic insulin resistance-related condition may lead to adaptation to some emotional responses, shifting from anxiety and worry to feelings of inadequacy and difficulty concentrating. This could be attributed to the constant coping and management demands of a chronic physical illness, which may lead to a sense of cognitive overload and being overwhelmed.

# Prescription patterns and insulin resistance-related comorbidities

An increased frequency of prescriptions of SSRIs, SARIs, SNRIs and tetracyclic and tricyclic antidepressants in the IR+ group was found, suggesting a more challenging treatment course. This is confirmed by the higher frequency of antidepressant switches and the use of a wider array of antidepressant classes, particularly in patients with MDD preceding insulin resistance-related diagnoses. The metabolic side-effect profiles of these antidepressant

classes warrant careful consideration. SSRIs are typically preferred for their relatively favourable side-effect profile, especially in patients with comorbid medical conditions.<sup>36</sup> SSRIs have been shown to improve glycaemic control in adults with comorbid MDD and T2DM in short-term studies, and have no long-term deleterious effects on glycaemic homeostasis.<sup>3</sup> Conversely, SNRIs and tetracyclic and tricyclic antidepressants, despite their efficacy, are associated with significant cardiometabolic side-effects, including hypertension, weight gain and dyslipidaemia, 36,37 posing potential exacerbation risks in the presence of underlying insulin resistance predisposition. The use of TCAs in these patients, often a choice of last resort due to their lower tolerability, suggests a clinical pivot towards more pharmacodynamically complex treatment options when first-line treatments fail. Conversely, a less frequent use of some antidepressant classes in the MDD-after-IR group probably reflects clinicians' attention to the metabolic side-effects of certain antidepressants and, consequently, a more conservative approach. Overall, these findings emphasise the importance of a personalised treatment strategy for MDD, especially for individuals with a personal or familiar history of insulin resistance-related conditions. Antidepressant selection must carefully weigh the risk:benefit ratio, prioritising patient safety and overall health in the context of pre-existing or heightened risk of insulin resistance.

# Insulin resistance-related conditions and treatment outcomes in depression

The association between insulin resistance-related conditions and higher odds of poorer treatment outcomes and overall treatment duration supports the hypothesis that metabolic dysregulation may be linked with difficult-to-treat depression. The association with poorer treatment outcomes was particularly evident when MDD diagnosis preceded insulin resistance-related conditions. This trajectory may suggest that the neurobiological and behavioural effects of depression, including stress-related hormonal imbalances and reduced physical activity, may predispose individuals to metabolic disturbances that probably worsen treatment response. 14,27,38 Chronic inflammation and oxidative stress, which are associated with insulin resistance, can impair serotonin signalling and synaptic plasticity, processes involved in antidepressant response. 14,39,40 Notably, the observed higher prescription of antidepressants and diverse pharmacological classes in IR+ individuals raises questions about the potential of pharmacotherapy in triggering or worsening insulin resistance-related conditions; indeed, patients with difficult-to-treat MDD may be more frequently exposed to medications with metabolic side-effects.<sup>37</sup> On the other hand, the observation in our sample that a broad phenotype of insulin resistance pathology - defined by the presence of any insulin resistance-related condition rather than specific ones - is linked to worse treatment outcomes when insulin resistance precedes MDD and may support a direct influence of metabolic health on psychiatric treatment effectiveness. Of note, the larger sample size of the cumulative insulin resistance phenotype probably increased the statistical power of this analysis, thus revealing associations not apparent in more narrowly defined groups. However, future research is needed to clarify whether insulin resistance-related conditions primarily aggravate depressive symptoms through metabolic dysregulation or directly impair antidepressant efficacy, because the current study design does not establish causality.

# **PGSs and future directions**

Our study did not identify significant associations between PGSs for insulin resistance-related conditions and treatment outcomes, although nominal associations were observed with PGS for CAD,

triglycerides and BMI in certain subgroups. The multifactorial nature of treatment outcomes, with a relatively modest contribution of common genetic variants, 41 and methodological limitations, may have impacted on the possibility of reaching statistical significance for these results. For example, the PGS approach used was not biologically informed, i.e. it did not prioritise SNPs based on their known or predicted functional impact, which may have improved PGS prediction accuracy. 42 Consistent with our findings, previous studies reported limited explanatory power of PGSs for insulin resistance-related conditions in antidepressant treatment outcomes. For instance, PGSs for CAD and BMI explained only 1.3 and 0.8% of SSRI treatment response variance, respectively, with notable cohort-specific and quartile-dependent differences in effect size.43 In one cohort, associations were evident only among individuals in the highest PGS quartile, while intermediate quartiles showed stronger effects in another. 43 Similarly, research on PGS for T2DM and depression has shown that significant associations were particularly evident in early-onset cases, or only nominally significant across ancestrally diverse cohorts.8

In addition to lifestyle modifications, addressing inflammatory-metabolic dysfunctions of MDD with new pharmacological interventions offers promising opportunities. Anti-inflammatory agents, such as anti-interleukin-6 antibodies and tumor necrosis factor- $\alpha$  inhibitors, have shown potential in alleviating depressive symptoms, particularly in individuals with elevated inflammatory biomarkers. Similarly, glucagon-like peptide-1 receptor agonists (GLP-1 RAs), such as liraglutide, offer dual benefits by improving glycaemic control and reducing systemic inflammation, with preliminary evidence of antidepressant effects. Integrating these pharmacological interventions with precision psychiatry tools, such as multivariable models incorporating more advanced PGS approaches, could optimise treatment personalisation.

# **Strengths and limitations**

This study should be viewed in the context of its strengths and limitations. Its strengths lie in its large sample size and the use of a comprehensive data-set from UKB. The inclusion of primary care data enriched the findings, providing a real-world perspective on the management of MDD in relation to insulin resistance-related conditions. However, its observational nature precludes causal inferences, and generalisability of the findings may be limited to similar healthcare settings. While the results demonstrate a strong association between insulin resistance-related conditions and poorer treatment outcomes in MDD, they cannot determine whether insulin resistance-related conditions primarily aggravate MDD, directly contribute to resistance or result from prolonged treatment resistance and pharmacological burden. Future longitudinal and experimental studies are required to disentangle the temporal and causal dynamics between insulin-resistance conditions, MDD severity and treatment outcomes. The demographic composition of UKB, predominantly consisting of females, older individuals and those of higher SES, does not mirror the general UK population.<sup>45</sup> Additionally, our analysis relied on proxy measures such as antidepressant switches for treatment non-response/ resistance. While these proxies are well established in the literature, 46,47 they depend on the completeness of EHRs and are not direct measures of treatment response. The interpretation of our results should consider potential biases introduced by missing data, such as gaps in prescription or diagnosis dates. Furthermore, our analysis did not consider prescription dosages, nor did it differentiate based on symptom severity or MDD phase (acute versus non-acute). Regarding PGS calculation, to prevent results inflation we could not use some of the larger GWAS sample, which was overlapping with our target UKB sample. While our findings demonstrate statistically significant associations between various insulin resistance-related conditions and treatment outcomes in depression, the predictive impact of these associations, as indicated by Nagelkerke's pseudo- $R^2$  and  $R^2$  values, was limited. This aligns with expectations for complex, multifactorial conditions such as MDD and insulin resistance-related traits, where a substantial portion of variance arises from unmeasured genetic, environmental and clinical factors. Nonetheless, the Hosmer–Lemeshow test results (P>0.05 in most models) indicated acceptable model fit, supporting the validity of the observed associations. Future research should incorporate other variables and advanced modelling approaches to better capture the full complexity of biopsychosocial factors that contribute to depression treatment outcomes.

#### **Discussion**

In conclusion, this study highlights a substantial prevalence of insulin resistance-related conditions among individuals with a history of MDD, highlighting a demographic profile characterised by later age of MDD onset, a propensity towards unhealthy lifestyle and a distinct clinical profile. Notably, the presence of insulin resistance-related conditions was found to be associated with heightened complexity in managing depression, as evidenced by an increase in antidepressant prescriptions, treatment nonresponse/resistance and prolonged treatment duration, particularly when MDD diagnosis preceded that of insulin resistance. These results advocate for careful antidepressant selection, mindful of potential metabolic adverse effects. Overall, these insights endorse the implementation of a holistic care model that surpasses traditional psychiatric management, incorporating metabolic assessments and lifestyle interventions to improve outcomes in patients with MDD. It is important for healthcare providers to regularly monitor metabolic health in patients with MDD, because early detection/treatment of insulin resistancerelated conditions holds the potential to enhance psychiatric and physical outcomes, particularly in patients with persistent or treatment-resistant MDD.

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# **Supplementary material**

The supplementary material can be found online at https://doi.org/10.1192/bjp.2025.82

## **Data availability**

The data that support the findings of this study are available from the UKB project site, subject to registration and application process. Further details can be found at https://www.ukbioba.nk.ac.uk. Returned data and code from single publications are also available through the UKB resource.

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## **Author contributions**

G.F.: writing – original draft preparation, conceptualisation, methodology, formal analysis, software, validation, investigation, data curation and visualisation; J.B.: writing – review and editing; B.F.: writing – review and editing; A.R.A.: writing – review and editing; D.D.R.: writing – review and editing; MNESYS – Mood and Psychosis Sub-Project (Spoke 5): writing – review and editing and funding acquisition; A.S.: supervision, conceptualisation, writing – review and editing, funding acquisition and resources; C.F.: supervision, conceptualisation, writing – review and editing, funding acquisition and resources.

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# **Declaration of interest**

A.S. is, or has been, a consultant/speaker for Abbott, Abbvie, Angelini, AstraZeneca, Clinical Data, Boehringer, Bristol-Myers Squibb, Eli Lilly, GlaxoSmithKline, Innovapharma, Italfarmaco, Janssen, Lundbeck, Naurex, Pfizer, Polifarma, Sanofi, Servier and Taliaz. B.F. has received educational speaking fees and travel support from Medice. The other authors declare no conflicts of interest.

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