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Efficacy and moderators of psychological interventions in treating subclinical symptoms of depression and preventing Major Depressive Disorder. Protocol for an individual patient data meta-analysis of randomized controlled trials

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Abstract

Introduction

The long-term effectiveness of psychological interventions for subclinical depression and the prevention of depression is unclear and effects vary among subgroups of patients indicating that not all patients profit from such interventions. Randomized trials are mostly underpowered to adequately examine subgroups and moderator effects. The aim of the present study is, therefore, to examine the short and long-term effects of psychological interventions compared to control groups in adults with subthreshold depression on depression symptom severity, treatment response, remission, deterioration, quality of life, anxiety, and the prevention of MDD onsets and moderators on individual patient- and study level using an individual-patient data meta-analysis approach.

Methods and analysis

Systematic searches in PubMed, PsycINFO, Embase and the Cochrane Central Register of Controlled Trials (CENTRAL) have been conducted. We will use the following types of outcome criteria: a) incidence of major depression, b) time to major depression onset, c) observer- and self-reported depression severity, d) response, e) remission, f) deterioration, g) quality of life, and h) anxiety. Multilevel models with participants nested within studies will be used. Missing data will be handled using a joint modeling approach to multiple imputation. A number of sensitivity analyses will be conducted in order to test the robustness of our findings.

Ethics and dissemination

The original investigators have obtained ethical approval for the data used in the present study. This study will summarize the available evidence on the short- and long-term effectiveness of preventive psychological interventions for the treatment of subthreshold depression and prevention of major depressive disorder. Identification of subgroups of patients in which those interventions are most effective will guide the development of evidence-based personalized interventions for patients with subthreshold depression.

Systematic review registration

This study has been registered with the PROSPERO database (no. CRD42017058585).

Strengths and limitations of this study

- A strength of the presented individual patient-data meta-analysis (IPD MA) is that this approach allows sufficient statistical power to evaluate specific effects for specific kinds of treatments for patients with certain characteristics, in order to select the best possible treatment for an individual patient (i.e. personalized medicine).
- One limitation of the IPD MA is that while investigating moderators of treatment outcome, one very much relies on the variables that have been assessed in the primary studies. However, many of the relevant predictors and moderators associated with depression onset or differential treatment response reported in the literature were not assessed in the included studies.
- Another limitation of the IPD MA approach is that some bias is introduced because not all eligible trials can be included in the analyses due to author non-response, lack of ethical approval to share the data or that data are not available anymore.

Introduction

Major Depressive Disorder (MDD) is highly prevalent,[1–4] associated with substantial impairment[5,6] and economic costs.[7–9] Psychological treatments have been shown to be effective in the treatment of depression.[10,11] However, it has been estimated that, even when assuming the hypothetical scenario of full coverage with and adherence to evidence-based treatments only approximately one third of the disease burden attributable to MDD can be averted.[12] Moreover, in practice the majority of depressed people remain untreated[3,13] even in high income countries.[14,15]

Therefore, attention has increasingly been focused on the prevention of MDD.[16,17] One specific form of prevention is indicated prevention. In such interventions subthreshold symptoms are treated in order to prevent the transition to a full-blown depressive disorder.[17]

Meta-analytic evidence shows that indicated psychological preventive approaches can be effective in preventing depressive episodes.[18] The latest systematic review on this topic, which included randomized trials that have been published up to March 2012, found psychological interventions for subclinical symptoms to reduce the risk for developing a Major Depressive Episode at 6 months (Incidence rate ratio[IRR] = .61; 5 studies) and at 12 months (IRR = .74; 4 studies). Since then, many more randomized controlled trials have been published, warranting an update of the evidence.

Moreover, the treatment of subclinical symptoms of depression itself is relevant. Subthreshold depressive symptoms are highly prevalent,[19] related to increased mortality,[20] poorer quality of life,[21] increased health care service utilisation,[22] and vast economic costs.[23] However, results for the treatment of subclinical symptoms are yet conflicting. Pharmacological interventions are unlikely to have a clinical advantage over placebos in treating subthreshold depression.[24] A recent meta-analysis, however, found small-to-moderate effect sizes for psychological interventions on depressive symptom severity at post-treatment compared to usual care.[25] However, four studies using clinician-rated outcomes did not indicate significant positive results. Moreover, we are not aware of any systematic review exploring the long-term effects of treatments for subclinical symptoms with regard to depression severity. In addition, effects on other relevant outcomes such as anxiety or quality of life have not been examined.

Another issue not yet addressed is the possibility that the effectiveness of psychological interventions for subthreshold depression varies across patients and not all subgroups of patients profit from such interventions. Given that the number of people from specific subgroups is often small in single trials, and randomized trials are usually powered to detect overall treatment effects,

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3 RCTs are mostly underpowered to adequately examine subgroup and moderator analyses.[26] As
4 studies also seldom report effectiveness for different patient characteristics, it is impossible to
5 examine patient-level moderators using traditional meta-analytic approaches.
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8 Individual participant data meta-analyses (IPD MA) can overcome some of the limitations of the
9 conventional MAs on study level.[27–29] By pooling the primary data of individual trials, it is possible
10 to conduct analyses not reported in original studies and obtain large enough sample sizes with
11 sufficient power to examine effects in relevant subgroups and identify outcome moderators.[30]
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15 The present study aims to examine the short and long-term effects of psychological interventions
16 compared to control groups in adults with subthreshold depression on depression symptom severity,
17 treatment response, remission, deterioration, quality of life, anxiety, and the prevention of MDD
18 onsets using an IPD MA approach. Moderators on individual patient-level (e.g., socio-demographic,
19 clinical characteristics) and study level (e.g., type of treatment delivery, number of sessions,
20 theoretical basis) on intervention outcome will be explored in the pooled dataset. In addition, we will
21 analyze intervention effects and moderators of effects in specific subgroups of interest (e.g., using
22 only data from patients with low education, chronic medical conditions, etc.).
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31 **Method**

32 *General study approach*

33 First, a systematic review will be performed to identify eligible papers, studies will be selected and
34 corresponding authors will be contacted for each of the identified papers and asked to provide raw
35 data from their study. The study will be completed in compliance with the PRISMA Statement.
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37 Individual patient data will be aggregated and a priori elected moderator variables will be analysed
38 using a multilevel model approach.
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44 *Eligibility criteria*

45 In this IPD MA, we will a) include randomized trials in which b) the effects of a psychological
46 treatment were compared with a comparison group (waiting list, care-as-usual, psychological
47 placebo, pill placebo, antidepressant medication) c) in adults d) with clinically relevant depressive
48 symptoms e) but no major depressive disorder at baseline, f) assessed with a standardized diagnostic
49 interview (see below) to exclude participants with full-blown mood disorder at baseline. Clinically
50 relevant depressive symptoms will be defined as scoring above a cut-off score on a self-rating
51 depression questionnaire; scoring above a cut-off score on a clinician-rated instrument; or meeting
52 criteria for minor depression according to the Diagnostic and Statistical Manual of Mental Disorders
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3 (DSM), International Classification of Diseases (ICD). We will also include studies in which participants
4 with a diagnosed depressive disorder were examined and we will then exclude participants with a
5 full-blown disorder on an individual basis using the primary data. No language restrictions will be
6 applied.
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10 11 *Types of outcome measures*

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13 We will use the following types of outcome criteria: a) incidence of MDD, b) time to MDD onset, c)
14 observer- and self-reported depression severity, d) response, e) remission, f) deterioration, g) quality
15 of life, and h) anxiety. MDD will be measured by clinical interviews such as the SCID,[31] CIDI,[32] or
16 MINI.[33] Depression severity will be measured using standardized depression outcome measures
17 such as the Beck Depression Inventory (BDI),[34] Hamilton Depression Rating Scale (HAM-D),[35] or
18 the Center for Epidemiological Depression Scale (CES-D).[36] If both observer-rated and self-report
19 measures are used, we will explore intervention effects on both outcome measure types. If several
20 observer-rated or self-report measures are used, preference will be given to the measures that are
21 used the most across the different studies in order to increase comparability. If the type of outcome
22 measures varies between studies, these measures will be transformed into standardized scores
23 (using the common metric approach[37] or, if this is not possible, z-transformation). We will also
24 dichotomize depression scores to explore effects on two response criteria (a 50% reduction in
25 symptoms for relative change; a minimum absolute change in symptoms according to the reliable
26 change index[38]) and remission (scoring below a predefined cut-off score). Deterioration rates will
27 be calculated using a predefined absolute worsening of symptoms from baseline to follow up using
28 the Reliable Change Index[40] and 50% symptom increase. Quality of life will be transformed to
29 quality-adjusted life years (QALYs), using the British value set for EQ-5D utility values[39] and
30 Brazier's algorithm for SF-6D utility values,[40] respectively. Anxiety severity will be measured using
31 standardized self-report measures, such as the HADS[41] or BAI.[42] Note that we are planning to
32 reduce the complexity for moderator analyses by only focusing on a) incidence of MDD and c)
33 depression severity.
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48 *Moderators*

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50 We will investigate both moderators on individual patient-level (e.g., socio-demographic, clinical
51 characteristics) as well as and on study level (e.g., type of treatment delivery, number of sessions,
52 theoretical basis). Published papers are examined to identify potential moderators on patient level
53 that have been assessed across studies. We will explore variables that have shown to predict
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3 differential treatment outcome in psychological treatments for depression[43,44] and variables that
4 are associated with depression onset.[45–47]
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6 Clinical and personality characteristics that will be investigated, if sufficiently available, include
7 depressive symptom severity,[48] lifetime-history of MDD,[49,50] number of previous depressive
8 episodes,[49,51] anxiety symptoms,[49] comorbid mental health disorder (e.g. anxiety disorder)[50],
9 previous exposure to depression treatment, family history of common mental health
10 disorders,[50,52,53] global assessment of functioning, sleeping problems,[54–56] neuroticism,[48]
11 recent life stress,[57] childhood adversities,[53] traumatic events,[58] significant life events (in the
12 previous year),[59,60], daily hassles, emotion regulation,[61] poor self-perceived health (quality of
13 life),[49,54,60] self-esteem,[62–64] (chronic) medical conditions,[55,56,65] physical functioning/
14 disability,[54] mastery, worrying, Body-Mass-Index, rumination, interpersonal problems,[51,60] body
15 dissatisfaction,[64,66] physical activity level,[54,67] diet quality,[67] alcohol / substance
16 use,[50,54,60] smoking,[54,65] resilience,[68] social support/ integration,[50,55,61,64] perceived
17 social rejection/ mobbing. Sociodemographic variables that shall be examined are sex,[52,65,69,70]
18 age,[50,69] education,[56,71] marital status,[71] relationship status,[69] living alone,[53]
19 employment,[53] ethnicity (minority status),[72] economic deprivation / poverty,[55,60,72]
20 parenthood (motherhood).[65] It is expected that not all studies that will be included assessed all
21 variables. Hence, variables will only be examined if sufficient data across studies are available.
22 Intervention characteristics that will be examined include the intervention format (individual, group,
23 or guided self-help), the number of treatment sessions, overall treatment duration, session
24 frequency,[73] the type of delivery (internet, face-to-face), the control condition (placebo/attention
25 control, care as usual, waitlist, alternative treatment), type of psychotherapy (cognitive behaviour
26 therapy, problem-solving, interpersonal or other type) and study quality.
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42 *Timing of outcome assessments*

43 All post-intervention assessments will be pooled and treated as one assessment, despite varying time
44 frames due to different intervention lengths. Treatment duration will be controlled for, if found to be
45 associated with the dependent variable. We expect varying follow-up periods of the studies and will
46 therefore categorize follow-ups into meaningful categories, such as follow-up that occurred 3-7
47 months (follow-up I), 8-13 months (follow up II), or over 14 months (follow-up III) after baseline.
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53 *Searches and Study Selection*

54 For the identification of potential studies for inclusion, we will use a database of papers on the
55 psychological treatment of depression described in detail elsewhere.[74] For this database, studies
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3 have been identified from Pubmed, PsychInfo, Embase and the Cochrane Central Register of
4 Controlled Trials. Additionally, previous meta-analyses of treatments for depression were screened
5 for this database to ensure that no randomized trial was missed. These searches identified a total of
6 16,407 abstracts (12,196 after the removal of duplicates), from this 1,885 full text papers of RCTs on
7 treatments for depression were retrieved for possible inclusion in the database. These papers will be
8 then screened for inclusion in this meta-analysis. A further literature search will be conducted for
9 studies published since the last update of the database. In addition, relevant authors in the field of
10 depression prevention will be asked whether they are aware of any yet unpublished study that might
11 fit the inclusion criteria.
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17 Corresponding authors will be contacted for each of the identified papers and will be asked to
18 provide raw data from their study. If an author does not respond after 1 month, a second attempt to
19 contact them will be made. If the second contact fails, another author of the study will be contacted
20 and invited to participate. A second attempt to contact this author will follow in another month if no
21 response is received and so forth until a maximum of three authors were contacted. Study data will
22 be considered unavailable in the event that no study authors have responded to multiple contact
23 attempts or if all contacted authors indicate that they no longer have access to the data. If authors
24 do not respond, are not able or not willing to share their data, we will compare these studies to the
25 included ones in terms of design, participants, intervention, and quality.
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34 *Risk of bias assessment*

35 The validity of the included studies will be assessed using four criteria from the Cochrane 'Risk of
36 Bias' assessment tool.[75] This tool identifies possible sources of bias, including: the adequate
37 generation of allocation sequence, the allocation concealment, blinding of assessors, and dealing
38 with incomplete outcome data (this is assessed as positive when intention-to-treat analyses were
39 conducted, meaning that all randomized patients were included in the analyses). Only data from
40 published papers will be used to determine the risk of bias in order to use a consistent procedure
41 across studies that does or does not share data. Two researchers will conduct the quality assessment
42 independently and agreement rates will be reported. Disagreement will be solved through
43 discussion.
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51 *Missing data*

52 IPD MA will be conducted according to the intention-to-treat principle. Missing data is handled using
53 a joint modeling approach to multiple imputation of individual participant data nested within studies.
54 [76–78] In particular, we will use the R package jomo that uses Markov Chain Monte Carlo (MCMC)
55 techniques to draw replacements for the missing values. [79] This procedure is based on a multilevel
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3 imputation model that considers associations between continuous and categorical variables both at
4 the level of participants (level 1) and studies (level 2). In addition, it allows for modeling between-
5 study heterogeneity in the covariance matrices, which is especially useful when imputing variables
6 that are completely missing from studies.[76] We will specify a multivariate empty imputation model
7 including all available participant (level 1) and study (level 2) characteristics.[80] Assignment to
8 intervention- vs. control-group will be used as a grouping variable in the imputation model to allow
9 for treatment-specific intercept, variance and covariance parameters. Based on the final model we
10 will generate at least 20 imputed data sets. The number of burn-in iterations and the number of
11 iterations between imputed data sets will be chosen so that convergence can be ensured.[80] In the
12 case of persistent convergence problems we will reduce the number of model parameters by
13 dropping predictors and/or imposing constraints to the model (e.g., assuming a common level 1
14 covariance matrices across studies).

21 22 23 24 *Analysis*

25 26 *Conventional meta-analysis on study level*

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28 We will first conduct a conventional meta-analysis, using data from the published papers. This will
29 allow us to identify whether studies that did not provide data might bias the results of our IPD MA.
30 This will be done by comparing those studies contributed to the IPD dataset to those who did not,
31 with regard to the outcomes, risk of bias and score other study characteristics.

32
33 First, we will calculate the IRR for developing a depressive disorder in the intervention compared
34 with the control group for each study based on published papers, and then pool the results using the
35 Comprehensive Meta-Analysis Software package, version 3. With regard to effects on depression
36 symptom severity, we will calculate Hedges' g as a measure of the effect size indicating the
37 difference between the intervention and control conditions at post-treatment. These analyses will be
38 done using a random-effects DerSimonian-Laird model[81] because considerable heterogeneity
39 between studies is expected. To test homogeneity of effect sizes, we will calculate the I^2 -statistic as
40 an indicator of heterogeneity in percentages.[82] A value of 0% indicates no observed heterogeneity,
41 and larger values indicate increasing heterogeneity, with 25% as low, 50% as moderate, and 75% as
42 high. We will calculate 95% confidence intervals using the non-central chi-squared-based
43 approach.[83] Small sample bias will be tested by inspecting the funnel plot visually, the Eggers test
44 and we will apply Duval and Tweedie's trim-and-fill procedure[84] which yields an estimate of the
45 effect size after small sample bias has been taken into account.[85]
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IPD Meta-Analysis

For the IPD meta-analysis we will utilise a one-step data-analysis approach. This is currently the best possible meta-analysis approach with the standard two-step analysis being at best equivalent in some scenarios.[86] All models are repeated for all of the defined follow-ups.

Effects on MDD disorder onset: We will use multilevel logistic regression analysis based on the imputed datasets for predicting the occurrence of MDD from treatment group using R. Patient level data will be treated as level 1, study level data as level 2 in all further analyses. Models will include both random intercepts and random slopes to capture both unobserved heterogeneity in trial populations (intercept) and trial effectiveness (slope). We will proceed to calculate the odds ratio (OR) and its 95% intervals and also calculate the numbers needed to be treated (NNT) and its 95%-confidence intervals in order to avoid one additional MDD. In addition, we will conduct two additional analyses explicitly taking into account that observation periods and time to MDD onset may differ between participants or studies. To control for differences in observation periods, we will use multilevel binomial regression analysis with a complementary log-log link and offset for time since baseline, which provides an estimate of the treatment effect in terms of the IRR for developing a MDD [87]. To deal with differences in time to MDD onset we will use multilevel Cox proportional hazard models, which provide an estimate of the treatment effect in terms of the hazard ratio for developing a MDD.

Effects on symptom severity: We will use a multilevel regression analysis predicting standardised depression severity scores from treatment group and controlling for baseline depression severity. Again, we will include both a random intercept and random slope for the treatment effects to capture both unobserved heterogeneity between study populations (intercept) and study effectiveness (slope). Hedges' g will be calculated as an effect size measure. The same approach will be used for analyzing effects on other continuous outcome measures including quality of life and anxiety.

Effects on response, remission and deterioration: The standard criteria for measuring response in psychotherapy outcome research for depression is a 50% reduction on a standardized depression measure.[88] However, it can be argued that in individuals with subclinical symptoms a relative reduction of 50% of symptoms might be clinically less meaningful compared to individuals with Major Depression. Hence we will additionally calculate response using a predefined absolute reduction in symptoms using the Reliable Change Index[38] Remission will be defined using standard cut-off scores of the respective instruments. Deterioration will be defined using a predefined absolute worsening of symptoms from baseline to follow up using the Reliable Change Index[38] and 50% symptom increase. Generally, event occurrence will be predicted from treatment group using

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3 multilevel logistic regression analysis. We will proceed to calculate the OR and its 95% intervals and
4 also calculate the numbers needed to be treated (NNT) and its 95%-confidence intervals in order to
5 achieve one additional response, respectively remission as compared to the control group.[89]

6 Effects on deterioration rates:

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9 Moderator Analyses: We will explore predictors of outcome (i.e., prognostic variables) and
10 moderators of the intervention effect (i.e., prescriptive variables) by including selected participant-
11 level and study level variables as well as their interaction with the intervention as additional
12 predictors in the multilevel (logistic) regression analyses. These analyses will be based on the total
13 sample (i.e., on the imputed datasets including all studies) and focus on predicting incidence of MDD,
14 depression severity and symptom deterioration. Predictors will be selected based on the amount of
15 available/missing data and the bivariate associations with outcome measures in the intervention-
16 and control-group. In order to increase statistical power, moderator analyses on long-term effects
17 will be done using combined follow up assessments in order that every included study contribute
18 data to the analysis.

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21 Subgroup Analyses: We also plan to examine the effectiveness of the interventions and moderators
22 of treatment outcome in subgroups that are of special interest for tailoring prevention programs (e.g.
23 older adults, low educated adults, minority status, mothers of new-borns, medical conditions, and
24 individuals without lifetime history of depression). These analyses will be based on subsamples. Note
25 that it will be necessary to generate new imputed datasets for these analyses to ensure congeniality
26 with the imputation model.[78] The same strategy will be applied to investigate effects and
27 moderators in specific intervention delivery forms (e.g., internet, guided/unguided self-help, group
28 format). However, whether these and other analyses in subgroups of interest should be conducted
29 depends on the number of studies/participants that are eligible.

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32 Sensitivity Analyses: A number of sensitivity analyses will be conducted in order test the robustness
33 of our findings. For example, we will run a separate model in which we exclude trials with high risk of
34 bias. If a sufficient number of studies include the same outcome measurement (e.g., for depression
35 severity), we will conduct separate analyses using only this specific outcome measurement, instead
36 of using the standardized score. We will also run a complete-case analysis and compare the results to
37 the intention-to-treat analysis in order to determine whether a difference exists between those that
38 dropped out from the trials compared to those who persisted. Other sensitivity analyses may be
39 necessary and will be decided on after all data have been collected and examined.

40 41 42 43 44 45 46 47 48 49 50 51 52 53 54 55 **Discussion**

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3 The burden attributable to major depression is immense and although effective treatments are
4 available, effects on disease burden is limited. Treatments so far failed to show that the prevalence
5 of depression in the population can be reduced, even in those countries in which evidence-based
6 treatments have been made widely available. Hence, new approaches are needed to reduce the
7 burden of MDD at population level. This study will provide a precise estimate of the effects of
8 indicated preventive interventions for subclinical symptoms of depression on short and long-term
9 depression severity, MDD onset and other relevant outcome criteria. Using an individual patient-data
10 meta-analytic approach we will be able to estimate specific effects in relevant subgroups of interest
11 and test whether the effectiveness depends on individual participant criteria.

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17 Such approaches have been used with some frequency in medicine, but are less often applied in
18 the field of psychological treatment outcome research, although recently a number of studies have
19 been published[90–96] and more seem to be on the way.[97–99] As the field moves towards
20 personalized medicine, it is crucial to know specific effects for specific kinds of treatments for
21 patients with certain characteristics, in order to select the best possible treatment for an individual
22 patient. IPD MA allow this with sufficient statistical power.

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27 However, such an approach has also a number of challenges. First, until such a study is published, it is
28 very likely that the search is already outdated and more trials have already been published that could
29 theoretically be included. This is due to the fact, that solely the processes of obtaining and
30 integrating the primary data into one dataset, take very long. Updating the search and including
31 additional datasets within the review process needs to be balanced to what can be gained by doing
32 so with regard to the specific research question investigated, as theoretically this process could be
33 done repeatedly. For example, if effects in relevant investigated subgroups are consistent across
34 trials, heterogeneity is low, the number of included studies and participants is reasonable, effects are
35 clinical meaningful with narrow confidence intervals for effect sizes, then it is unlikely that the
36 inclusion of an additional study would result in meaningful changes that would justify the delay in
37 publishing the results to be available for the scientific community and policy makers. On the other
38 hand, if differences of effect sizes between specific subgroups are substantial, but moderator
39 analyses are underpowered to detect such a difference and the inclusion of additional studies would
40 change that, the potential additional value of updating the dataset potentially would outweigh the
41 disadvantages. Second, a limitation of the IPD approach is that one very much relies with regard to
42 investigating moderators of treatment outcome, on the variables that have been assessed in the
43 primary study. In addition, many relevant predictors and moderators associated with depression
44 onset or differential treatment response in the literature, such as for example lifetime history of
45 depression, childhood adversities are not included in many of the published studies. However, recent
46 advantages in statistics allow not only to account for between study heterogeneity when imputing
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3 missing values but also to impute variables that are systematically missing in studies.[76,100]
4 Nevertheless, we argue that authors should include variables in primary studies that potentially
5 might explain heterogeneity of treatment effects, even when the study is not powered to reliably
6 investigate differential treatment effects. This would allow using these data in IPD studies and might
7 bring the field of precision medicine in psychological treatment outcome research substantially
8 forward. Third, another challenge with IPD meta-analyses is that often not all available trials can be
9 included in the dataset due to author non-response, lack of ethical approval to share the data or that
10 data are not available anymore. This might introduce some bias, which is being addressed by
11 comparing IPD findings with those of traditional meta-analyses in the present study.
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3 *Contributors*
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5 DDE, PC conceptualized and designed the study, PC contacted the primary authors, JR and CB are
6 responsible for building the database. JZ is responsible for the data analyses. DDE drafted the
7 manuscript; all authors critically revised the manuscript, read and approved the final version.
8
9

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11

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13

14 *Competing interests*
15

16 None declared.
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20 *Ethics*
21

22 This paper is a study protocol for an individual patient data meta-analysis and does not require
23 ethical approval. Anonymized data collected are managed by CB and JR and will be available for the
24 complete research team.
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30 *Data sharing statement*
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32 Access to the data can be requested from the first author.
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BMJ Open

Efficacy and moderators of psychological interventions in treating subclinical symptoms of depression and preventing Major Depressive Disorder onsets: Protocol for an individual patient data meta-analysis of randomized controlled trials

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Abstract

Introduction

The long-term effectiveness of psychological interventions for the treatment of subthreshold depression and the prevention of depression is unclear and effects vary among subgroups of patients indicating that not all patients profit from such interventions. Randomized clinical trials are mostly underpowered to examine adequately subgroups and moderator effects. The aim of the present study is, therefore, to examine the short- and long-term as well as moderator effects of psychological interventions compared to control groups in adults with subthreshold depression on depressive symptom severity, treatment response, remission, symptom deterioration, quality of life, anxiety, and the prevention of major depressive disorder (MDD) onsets on individual patient- and study level using an individual-patient data meta-analysis approach.

Methods and analysis

Systematic searches in PubMed, PsycINFO, Embase and the Cochrane Central Register of Controlled Trials (CENTRAL) were conducted. We will use the following types of outcome criteria: a) onset of major depression, b) time to major depression onset, c) observer- and self-reported depressive symptom severity, d) response, e) remission, f) symptom deterioration, g) quality of life, h) anxiety, and i) suicidal thoughts and behaviors. Multilevel models with participants nested within studies will be used. Missing data will be handled using a joint modeling approach to multiple imputation. A number of sensitivity analyses will be conducted in order to test the robustness of our findings.

Ethics and dissemination

The investigators of the primary trials have obtained ethical approval for the data used in the present study and for sharing the data, if this was necessary according to local requirements and was not covered from the initial ethic assessment.

This study will summarize the available evidence on the short- and long-term effectiveness of preventive psychological interventions for the treatment of subthreshold depression and prevention of major depressive disorder onset. Identification of subgroups of patients in which those interventions are most effective will guide the development of evidence-based personalized interventions for patients with subthreshold depression.

Systematic review registration

This study has been registered with the PROSPERO database (no. CRD42017058585).

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For peer review only

Strengths and limitations of this study

- A strength of the presented individual patient-data meta-analysis (IPD MA) is that this approach allows sufficient statistical power to evaluate specific effects for specific kinds of treatments for patients with certain characteristics, in order to select the best possible treatment for an individual patient (i.e. personalized medicine).
- One limitation of the IPD MA is that while investigating moderators of treatment outcome, one very much relies on the variables that have been assessed in the primary studies. However, many of the relevant predictors and moderators associated with depression onset or differential treatment response reported in the literature were not assessed in the included studies.
- Another limitation of the IPD MA approach is that some bias is introduced because not all eligible trials can be included in the analyses due to author non-response, lack of ethical approval to share the data or that data are not available anymore.

Introduction

Major Depressive Disorder (MDD) is highly prevalent,[1–4] associated with substantial impairment[5,6] and economic costs.[7–9] Psychological treatments have been shown to be effective in the treatment of depression.[10,11] However, it has been estimated that even under the hypothetical scenario of full coverage with and adherence to evidence-based treatments approximately only one third of the disease burden attributable to MDD could be averted.[12] Moreover, in practice the majority of depressed people remain untreated[3,13], even in high income countries.[14,15]

Therefore, attention has increasingly been shifted to the prevention of MDD onsets.[16,17] One specific form of prevention is indicated prevention. In such interventions subthreshold symptoms are treated in order to prevent the transition to a full-blown depressive disorder.[17] Meta-analytic evidence shows that indicated psychological preventive approaches can be effective in preventing depressive episodes.[18] The latest systematic review, which included randomized trials that have been published up to March 2012, found psychological interventions for subclinical symptoms to be effective in reducing the risk of developing a MDD at 6-month (Incidence rate ratio[IRR] = 0.61; 5 studies) and 12-month follow-up (IRR = 0.74; 4 studies). Since then, many more randomized controlled trials have been published, warranting an update of the evidence.

Moreover, the treatment of subclinical symptoms of depression itself is relevant. Subthreshold depressive symptoms are highly prevalent,[19] related to increased mortality,[20] poorer quality of life,[21] increased health care service utilisation,[22] and vast economic costs.[23] However, results for the treatment of subclinical symptoms are yet conflicting. Pharmacological interventions are unlikely to have a clinical advantage over placebos in treating subthreshold depression.[24] In addition, although a recent meta-analysis found small-to-moderate effect sizes for psychological interventions on depressive symptom severity at post-treatment compared to usual care,[25] four studies using clinician-rated outcomes did not indicate significant positive results. [26] Moreover, we are not aware of any systematic review exploring the long-term effects of treatments for subclinical symptoms with regard to depressive symptom severity, and effects on other relevant outcomes such as anxiety or quality of life have not been examined.

Another issue not yet addressed is the possibility that the effectiveness of psychological interventions for subthreshold depression varies across patients and not all subgroups of patients profit from such interventions. Given that the number of people from specific subgroups is often small in single trials, and randomized trials are usually powered to detect overall treatment effects, RCTs are mostly underpowered to perform adequately subgroup and moderator analyses.[27] As

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3 studies also seldom report effectiveness for different patient characteristics, it is impossible to
4 examine patient-level moderators using traditional meta-analytic approaches.
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6 Individual participant data meta-analyses (IPD MA) can overcome some of the limitations of the
7 conventional MAs on study level.[28–30] By pooling the primary data of individual trials, it is possible
8 to conduct analyses not reported in original studies and obtain large enough sample sizes with
9 sufficient power to examine effects in relevant subgroups and identify outcome moderators.[31]
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12 The present study aims to examine the short- and long-term effects of psychological
13 interventions compared to control groups in adults with subthreshold depression on depressive
14 symptom severity, treatment response, remission, symptom deterioration, quality of life, anxiety,
15 and the prevention of MDD onsets using an IPD MA approach. Moderators on individual patient-level
16 (e.g., socio-demographic, clinical characteristics) and study level (e.g., type of treatment delivery,
17 number of sessions, theoretical basis) on intervention outcome will be explored in the pooled
18 dataset. In addition, we will analyze intervention effects and moderators of effects in specific
19 subgroups of interest (e.g., using only data from patients with low education, chronic medical
20 conditions, etc.).
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31 **Method**

32 *General study approach*

33 First, a systematic review is performed to identify eligible papers. Corresponding authors of selected
34 studies will be contacted and asked to provide raw data from their studies. The current study will be
35 completed in compliance with the PRISMA Statement. Individual patient data will be aggregated and
36 a priori defined moderator variables will be analysed using a multilevel model approach.
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41 *Eligibility criteria*

42 In this IPD MA, we will a) include randomized trials in which b) the effects of a psychological
43 treatment (delivered individually, in a group-, bibliotherapy, internet-based format) were compared
44 with a comparison group (waiting list, care-as-usual, psychological placebo, pill placebo,
45 antidepressant medication) c) in adults d) with clinically relevant depressive symptoms e) but no
46 major depressive disorder at baseline, f) assessed with a standardized diagnostic interview (see
47 below) to exclude participants with full-blown mood disorder at baseline. Psychological interventions
48 are defined as the application of psychological mechanisms and interpersonal stances derived from
49 psychological principles for the purpose of assisting people to modify their behaviours, cognitions,
50 emotions, and/or other personal characteristics in directions that the participants deem desirable
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3 [32,33].Clinically relevant depressive symptoms will be defined as scoring above a cut-off score on a
4 self-rating depression questionnaire; scoring above a cut-off score on a clinician-rated instrument; or
5 meeting criteria for minor depression according to the Diagnostic and Statistical Manual of Mental
6 Disorders (DSM),or the International Classification of Diseases (ICD). We will also include studies in
7 which participants with a diagnosed depressive disorder were examined and we will then exclude
8 participants with a full-blown disorder on an individual basis using the primary data. No language
9 restrictions will be applied.
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16 *Types of outcome measures*

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18 We will use the following types of outcome criteria: a) onset of MDD, b) time to MDD onset, c)
19 observer- and self-reported depressive symptom severity, d) response, e) remission, f) symptom
20 deterioration, g) quality of life, h) anxiety, and i) suicidal thoughts and behavior. MDD will be
21 assessed with clinical interviews such as the SCID,[34] CIDI,[35] or MINI.[36] Depressive symptom
22 severity will be measured using standardized depression outcome measures such as the Beck
23 Depression Inventory (BDI),[37] Hamilton Depression Rating Scale (HAM-D),[38] or the Center for
24 Epidemiological Depression Scale (CES-D).[39] If both observer-rated and self-report measures are
25 available, we will explore intervention effects on both outcome measure types. If several observer-
26 rated or self-report measures are used, preference will be given to the mostly used measures across
27 the different studies in order to increase comparability. If the type of outcome measures varies
28 between studies, these measures will be transformed into standardized scores (using the common
29 metric approach[40] or, if this is not possible, z-transformation). We will also dichotomize scores on
30 depressive symptoms to explore effects on two response criteria (a 50% reduction in symptoms for
31 relative change; a minimum absolute change in symptoms according to the reliable change
32 index[41]) and remission (scoring below a predefined cut-off score). Symptom deterioration rates will
33 be calculated using a predefined absolute worsening of symptoms from baseline to follow-up using
34 the Reliable Change Index[40] and 50% symptom increase. Quality of life will be transformed to
35 quality-adjusted life years (QALYs), using, if possible, the British value set for EQ-5D-3L utility
36 values[42] and Brazier's algorithm for SF-6D utility values,[43] respectively. Anxiety severity will be
37 measured using standardized self-report measures, such as the HADS[44] or BAI.[45] Note that we
38 are planning to reduce the complexity for moderator analyses by only focusing on a) onset of MDD
39 and c) depressive symptom severity.
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54 *Moderators*

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3 We will investigate both moderators on individual patient-level (e.g., socio-demographic, clinical
4 characteristics) as well as and on study level (e.g., type of treatment delivery, number of sessions,
5 theoretical basis). Published papers are examined to identify potential moderators on patient level
6 that have been assessed across studies. We will explore variables that have shown to predict
7 differential treatment outcome in psychological treatments for depression[46,47] and variables that
8 are associated with depression onset.[48–50]
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12 Clinical and personality characteristics that shall be investigated include depressive symptom
13 severity,[51] lifetime-history of MDD,[52,53] number of previous depressive episodes,[52,54] anxiety
14 symptoms,[52] comorbid mental health disorder (e.g. anxiety disorder)[53], previous exposure to
15 depression treatment, family history of common mental health disorders,[53,55,56] global
16 assessment of functioning, sleeping problems,[57–59] neuroticism,[51] recent life stress,[60]
17 childhood adversities,[56] traumatic events,[61] significant life events (in the previous year),[62,63],
18 daily hassles, emotion regulation,[64] poor self-perceived health (quality of life),[52,57,63] self-
19 esteem,[65–67] (chronic) medical conditions,[58,59,68] physical functioning/ disability,[57] mastery,
20 worrying, Body-Mass-Index, rumination, interpersonal problems,[54,63] body dissatisfaction,[67,69]
21 physical activity level,[57,70] diet quality,[70] alcohol / substance use,[53,57,63] smoking,[57,68]
22 resilience,[71] social support/ integration,[53,58,64,67] perceived social rejection/ mobbing.
23 Sociodemographic variables that shall be examined are sex,[55,68,72,73] age,[53,72]
24 education,[59,74] marital status,[74] relationship status,[72] living alone,[56] employment,[56]
25 ethnicity (minority status),[75] economic deprivation / poverty,[58,63,75] parenthood
26 (motherhood).[68] It is expected that not all studies that will be included assessed all variables.
27 Hence, a precondition for including a variable as a moderator in the actual analyses is availability of
28 sufficient data . Intervention characteristics that will be examined include the intervention format
29 (individual, group, or guided self-help), the number of treatment sessions, overall treatment
30 duration, session frequency,[76] the type of delivery (internet, face-to-face), the control condition
31 (placebo/attention control, care as usual, waitlist, alternative treatment), type of psychotherapy
32 (cognitive behaviour therapy, problem-solving, interpersonal or other type) and study quality.
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48 *Timing of outcome assessments*

49 All post-intervention assessments will be pooled and treated as one assessment, despite varying time
50 frames in included studies. Treatment duration will be controlled for, if found to be associated with
51 the dependent variable. We expect varying follow-up periods of the studies and will therefore
52 categorize follow-ups into meaningful categories, such as follow-up that occurred 3-7 months
53 (follow-up I), 8-13 months (follow up II), or over 14 months (follow-up III) after baseline.
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Searches and Study Selection

For the identification of potential studies for inclusion, we will use a database of papers on the psychological treatment of depression described in detail elsewhere.[77] For this database, studies have been identified from Pubmed, PsychInfo, Embase and the Cochrane Central Register of Controlled Trials. In addition, previous meta-analyses of treatments for depression were screened for this database to ensure that no randomized trial was missed. These searches identified a total of 16,407 abstracts (12,196 after the removal of duplicates), from this 1,885 full text papers of RCTs on treatments for depression were retrieved for possible inclusion in the database. These papers will be screened for inclusion in this meta-analysis. A further literature search will be conducted for studies published since the last update of the database (studies published up to December 2017 will be considered for inclusion). In addition, relevant authors in the field of depression prevention will be asked whether they are aware of any yet unpublished study that might fit the inclusion criteria.

Corresponding authors will be contacted for each of the identified papers and will be asked to provide raw data from their study. If an author does not respond after 1 month, a second attempt to contact him/her will be made. If the second contact fails, another author of the study will be contacted and invited to participate. A second attempt to contact this author will follow a month later if no response is received and so forth until a maximum of three authors were contacted. Study data will be considered unavailable in the event that no study author has responded to multiple contact attempts or if all contacted authors indicate that they no longer have access to the data. If authors do not respond, are not able or not willing to share their data, we will compare these studies to the included ones in terms of design, participants, intervention, and quality.

Risk of bias assessment

The validity of the included studies will be assessed using four criteria from the Cochrane 'Risk of Bias' assessment tool.[78] This tool identifies possible sources of bias, including: the adequate generation of allocation sequence, the allocation concealment, blinding of assessors, and dealing with incomplete outcome data (this is assessed as positive when intention-to-treat analyses were conducted, meaning that all randomized participants were included in the analyses). Only data from published papers will be used to determine the risk of bias in order to use a consistent procedure across studies that does or does not share data. Two researchers will conduct the quality assessment independently and agreement rates will be reported. Disagreement will be solved through discussion.

Missing data

IPD MA will be conducted according to the intention-to-treat principle. Missing data is handled using a joint modeling approach to multiple imputation of individual participant data nested within studies. [79–81] In particular, we will use the R package jomo that uses Markov Chain Monte Carlo (MCMC) techniques to draw replacements for the missing values. [82] This procedure is based on a multilevel imputation model that considers associations between continuous and categorical variables both at the level of participants (level 1) and studies (level 2). In addition, it allows for modeling between-study heterogeneity in the covariance matrices, which is especially useful when imputing variables that are completely missing from studies. [79] We will specify a multivariate empty imputation model including all available participant (level 1) and study (level 2) characteristics. [83] Assignment to intervention- vs. control-group will be used as a grouping variable in the imputation model to allow for treatment-specific intercept, variance and covariance parameters. Based on the final model, we will generate at least 20 imputed data sets. The number of burn-in iterations and the number of iterations between imputed data sets will be chosen so that convergence can be ensured. [83] In the case of persistent convergence problems, we will reduce the number of model parameters by dropping predictors and/or imposing constraints to the model (e.g., assuming a common level 1 covariance matrices across studies).

Analysis

Conventional meta-analysis on study level

We will first conduct a conventional meta-analysis, using data from the published papers. This will enable us to examine whether studies that did not provide data might bias the results of our IPD MA. This will be done by comparing those studies contributed to the IPD dataset to those who did not with regard to the outcomes, risk of bias and other study characteristics.

First, we will calculate the IRR for developing a depressive disorder in the intervention compared to the control group for each study based on published papers, and then pool the results using the Comprehensive Meta-Analysis Software package, version 3. With regard to effects on depressive symptom severity, we will calculate Hedges' g as a measure of the effect size indicating the difference between the intervention and control conditions at post-treatment. These analyses will be done using a random-effects DerSimonian-Laird model [84] because considerable heterogeneity between studies is expected. To test homogeneity of effect sizes, we will calculate the I^2 -statistic as an indicator of heterogeneity in percentages. [83] A value of 0-40% indicates unimportant heterogeneity, and larger values indicate increasing heterogeneity, with 30-60% as moderate, 50-90% substantial and 75-100% as considerable. We will calculate 95% confidence intervals using the

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3 non-central chi-squared-based approach.[85] Small sample bias will be tested by inspecting the
4 funnel plot visually, the Eggers test, and Duval and Tweedie's trim-and-fill procedure,[86] which
5 yields an estimate of the effect size after small sample bias has been taken into account.[87]
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10 IPD Meta-Analysis

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12 For the IPD meta-analysis we will utilise a one-step data-analysis approach. This is currently the best
13 possible meta-analysis approach with the standard two-step analysis being at best equivalent in
14 some scenarios.[88] All models are repeated for all of the defined follow-ups.
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17 Effects on MDD onset: We will use multilevel logistic regression analysis based on the imputed
18 datasets for predicting the occurrence of MDD, including the assignment to intervention- vs. control-
19 group as the focal predictor. Patient level data will be treated as level 1 and study level data as level 2.
20 Models will include both random intercepts and random slopes to capture both unobserved
21 heterogeneity in trial populations (intercept) and trial effectiveness (slope). We will calculate odds
22 ratios (OR) and corresponding 95% confidence intervals and also calculate the numbers needed to
23 treat (NNT) and corresponding 95% confidence intervals in order to avoid one additional MDD. In
24 addition, we will conduct two additional analyses taking varying observation periods and time to
25 MDD onset explicitly into account. To control for differences in observation periods, we will use
26 multilevel binomial regression analysis with a complementary log-log link and offset for time since
27 baseline, which provides an estimate of the treatment effect in terms of the IRR for developing a
28 MDD.[89] To assess differences in time to MDD onset, we will use multilevel Cox proportional hazard
29 models, which provide an estimate of the treatment effect in terms of the hazard ratio for
30 developing a MDD.
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40 Effects on symptom severity: We will predict standardised depressive symptom severity scores from
41 intervention- vs. control- group and control for baseline depressive symptom severity using a
42 multilevel linear regression analysis. Again, we will include both a random intercept and random
43 slope for treatment effects to capture both unobserved heterogeneity between study populations
44 (intercept) and study effectiveness (slope). Hedges' g will be calculated as an effect size measure. The
45 same approach will be used for analyzing effects on other continuous outcome measures including
46 quality of life and anxiety and suicidal ideation.
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51 Effects on response, remission and symptom deterioration: The standard criterion for measuring
52 response in psychotherapy outcome research for depression is a 50% reduction on a standardized
53 depression measure.[90] However, it can be argued that in individuals with subclinical symptoms a
54 relative reduction of 50% of symptoms might be clinically less meaningful compared to individuals
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3 with major depression. Hence, we will additionally calculate response using a predefined absolute
4 reduction in symptoms using the Reliable Change Index[41] Remission will be defined using standard
5 cut-off scores of the respective instruments. Symptom deterioration will be defined using a
6 predefined absolute worsening of symptoms from baseline to follow up using the Reliable Change
7 Index[41] and 50% symptom increase. Generally, event occurrence will be predicted from treatment
8 group using multilevel logistic regression analysis. We will proceed to calculate the OR and its 95%
9 confidence intervals and also calculate the numbers needed to treat (NNT) and its 95% confidence
10 intervals in order to achieve one additional response, respectively remission as compared to the
11 control group.[91]

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17 Moderator Analyses: We will explore predictors of outcome (i.e., prognostic variables) and
18 moderators of the intervention effect (i.e., prescriptive variables) by including selected participant-
19 level and study level variables as well as their interactions with the intervention as additional
20 predictors in the multilevel (logistic) regression analyses. These analyses will be based on the total
21 sample (i.e., on the imputed datasets including all studies) and focus on predicting onset of MDD,
22 depressive symptom severity and symptom deterioration. Variables will be selected based on the
23 combination of multiple criteria, including the amount of available/missing data, the bivariate
24 associations with outcome measures in the intervention- and control-group, and the convergence of
25 the multiple imputation model. In order to increase statistical power, moderator analyses on long-
26 term effects will be done using combined follow-up assessments to include all studies that contribute
27 follow-up data.

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35 Subgroup Analyses: We also plan to examine the effectiveness of the interventions and moderators
36 of treatment outcome in subgroups that are of special interest for tailoring prevention programs (e.g.
37 older adults, low educated adults, minority status, mothers of new-borns, medical conditions, and
38 individuals without lifetime history of depression). These analyses will be based on subsamples. Note
39 that it will be necessary to generate new imputed datasets for these analyses to ensure congeniality
40 with the imputation model.[81] The same strategy will be applied to investigate effects and
41 moderators in specific intervention delivery forms (e.g., internet, guided/unguided self-help, group
42 format). However, whether these and other analyses in subgroups of interest should be conducted
43 depends on the number of studies/participants that are eligible.

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50 Sensitivity Analyses: A number of sensitivity analyses will be conducted in order to test the
51 robustness of our findings. For example, we will run a separate model in which we exclude trials with
52 high risk of bias. If a sufficient number of studies include the same outcome measurement (e.g., for
53 depressive symptom severity), we will conduct separate analyses using only this specific outcome
54 measurement, instead of using the standardized score. We will also run a complete-case analysis and

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3 compare the results to the intention-to-treat analysis in order to determine whether a difference
4 exists between those that dropped out from the trials compared to those who persisted. Other
5 sensitivity analyses may be necessary and will be decided on after all data have been collected and
6 examined.
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10 Discussion

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12 The burden attributable to major depression is immense and although effective treatments are
13 available, effects on disease burden is limited. Treatments so far failed to show that the prevalence
14 of depression in the population can be reduced, even in those countries in which evidence-based
15 treatments have been made widely available. Hence, new approaches are needed to reduce the
16 burden of MDD at population level. This study will provide a precise estimate of the effects of
17 indicated preventive interventions for subclinical symptoms of depression on short- and long-term
18 depressive symptom severity, MDD onset and other relevant outcome criteria. Using an individual
19 patient-data meta-analytic approach, we will be able to estimate specific effects in relevant
20 subgroups of interest and test whether the effectiveness depends on individual participant criteria.
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24 Such approaches have been used with some frequency in medicine, but are less often applied in
25 the field of psychological treatment outcome research, although recently a number of studies have
26 been published[92–98] or are in preparation.[99–101] As the field moves towards personalized
27 medicine, it is crucial to know specific effects for specific kinds of treatments for patients with certain
28 characteristics in order to select the best possible treatment for an individual patient. IPD MA allows
29 to do this with sufficient statistical power.
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37 However, such an approach also has a number of challenges. First, until such a study is published, it is
38 very likely that the search is already outdated and more trials have already been published that could
39 theoretically be included. This is due to the fact that solely the process of obtaining and integrating
40 primary data into one dataset takes very long. Updating the search and including additional datasets
41 within the review process needs to be balanced to what can be gained by doing so with regard to the
42 specific research question investigated, as theoretically this process could be done repeatedly. For
43 example, if effects in relevant investigated subgroups are consistent across trials, heterogeneity is
44 low, the number of included studies and participants is reasonable, effects are clinically meaningful
45 with narrow confidence intervals for effect sizes, then it is unlikely that the inclusion of an additional
46 study would result in meaningful changes that would justify the delay in publishing the results to be
47 available for the scientific community and policy makers. On the other hand, if differences of effect
48 sizes between specific subgroups are substantial, but moderator analyses are underpowered to
49 detect such a difference and the inclusion of additional studies would change this, the additional
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3 value of updating the dataset would potentially outweigh the disadvantages. Second, a limitation of
4 the IPD MA approach is that one very much relies on the variables that have been assessed in the
5 primary study. In addition, many relevant predictors and moderators associated with depression
6 onset or differential treatment response in the literature, such as for example lifetime history of
7 depression, childhood adversities are not included in many of the published studies. However, recent
8 advantages in statistics allow not only to account for between study heterogeneity when imputing
9 missing values but also to impute variables that are systematically missing in studies.[79,102]
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11 Nevertheless, we argue that authors should include variables in primary studies that might
12 eventually explain heterogeneity of treatment effects, even when the study is not powered to
13 reliable investigate differential treatment effects. This would allow using these data in IPD MA
14 studies and might bring the field of precision medicine in psychological treatment outcome research
15 substantially forward. Third, another challenge with IPD MA is that often not all available trials can be
16 included in the dataset due to author non-response, lack of ethical approval to share the data or that
17 data are not available anymore. This might introduce some bias, which is being addressed by
18 comparing IPD findings with those of traditional meta-analyses in the present study.
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30 *Ethics and dissemination*

31 This paper is a study protocol for an individual patient data meta-analysis and does not require
32 ethical approval. The investigators of the primary trials have obtained ethical approval for the data
33 used in the present study and for sharing the data, if this was necessary according to local
34 requirements and was not covered from the initial ethic assessment. Only anonymized data are
35 included in the dataset which does not allow the identification of individual trial participants.
36 Anonymized data collected are managed by CB and JR and will be available for the complete research
37 team. External research can request access to the dataset for secondary analyses after publication of
38 the results specified in this protocol, if local requirement of the original data should allow this.
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45 This study will summarize the available evidence on the short- and long-term effectiveness of
46 preventive psychological interventions for the treatment of subthreshold depression and prevention
47 of major depressive disorder onset. Identification of subgroups of patients in which those
48 interventions are most effective will guide the development of evidence-based personalized
49 interventions for patients with subthreshold depression.
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54 *Authors' contributors*

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3 DDE, PC conceptualized and designed the study, PC contacted the primary authors, JR and CB are
4 responsible for building the database. JZ is responsible for the data analyses. DDE drafted the
5 manuscript and is guarantor of the review; all authors critically revised the manuscript, read and
6 approved the final version.
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18 *Competing interests*
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20 None declared.
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25 *Data sharing statement*
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27 Access to the data can be requested from the first author.
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PRISMA-P (Preferred Reporting Items for Systematic review and Meta-Analysis Protocols) 2015 checklist: recommended items to address in a systematic review protocol*

Section and topic	Item No	Checklist item	page
ADMINISTRATIVE INFORMATION			
Title:			
Identification	1a	Identify the report as a protocol of a systematic review	1
Update	1b	If the protocol is for an update of a previous systematic review, identify as such	/
Registration	2	If registered, provide the name of the registry (such as PROSPERO) and registration number	2
Authors:			
Contact	3a	Provide name, institutional affiliation, e-mail address of all protocol authors; provide physical mailing address of corresponding author	1
Contributions	3b	Describe contributions of protocol authors and identify the guarantor of the review	14
Amendments	4	If the protocol represents an amendment of a previously completed or published protocol, identify as such and list changes; otherwise, state plan for documenting important protocol amendments	/
Support:			
Sources	5a	Indicate sources of financial or other support for the review	14
Sponsor	5b	Provide name for the review funder and/or sponsor	14
Role of sponsor or funder	5c	Describe roles of funder(s), sponsor(s), and/or institution(s), if any, in developing the protocol	14
INTRODUCTION			
Rationale	6	Describe the rationale for the review in the context of what is already known	4
Objectives	7	Provide an explicit statement of the question(s) the review will address with reference to participants, interventions, comparators, and outcomes (PICO)	5
METHODS			
Eligibility criteria	8	Specify the study characteristics (such as PICO, study design, setting, time frame) and report characteristics (such as years considered, language, publication status) to be used as criteria for eligibility for the review	5,6
Information sources	9	Describe all intended information sources (such as electronic databases, contact with study authors, trial registers or other grey literature sources) with planned dates of coverage	7,8
Search strategy	10	Present draft of search strategy to be used for at least one electronic database, including planned limits, such that it could be repeated	7
Study records:			
Data	11a	Describe the mechanism(s) that will be used to manage records and data throughout the review	8

management			
Selection process	11b	State the process that will be used for selecting studies (such as two independent reviewers) through each phase of the review (that is, screening, eligibility and inclusion in meta-analysis)	7,8
Data collection process	11c	Describe planned method of extracting data from reports (such as piloting forms, done independently, in duplicate), any processes for obtaining and confirming data from investigators	8
Data items	12	List and define all variables for which data will be sought (such as PICO items, funding sources), any pre-planned data assumptions and simplifications	6,7
Outcomes and prioritization	13	List and define all outcomes for which data will be sought, including prioritization of main and additional outcomes, with rationale	6
Risk of bias in individual studies	14	Describe anticipated methods for assessing risk of bias of individual studies, including whether this will be done at the outcome or study level, or both; state how this information will be used in data synthesis	8
Data synthesis	15a	Describe criteria under which study data will be quantitatively synthesised	9
	15b	If data are appropriate for quantitative synthesis, describe planned summary measures, methods of handling data and methods of combining data from studies, including any planned exploration of consistency (such as I^2 , Kendall's τ)	6,9
	15c	Describe any proposed additional analyses (such as sensitivity or subgroup analyses, meta-regression)	11
	15d	If quantitative synthesis is not appropriate, describe the type of summary planned	/
Meta-bias(es)	16	Specify any planned assessment of meta-bias(es) (such as publication bias across studies, selective reporting within studies)	9
Confidence in cumulative evidence	17	Describe how the strength of the body of evidence will be assessed (such as GRADE)	12,13

*** It is strongly recommended that this checklist be read in conjunction with the PRISMA-P Explanation and Elaboration (cite when available) for important clarification on the items. Amendments to a review protocol should be tracked and dated. The copyright for PRISMA-P (including checklist) is held by the PRISMA-P Group and is distributed under a Creative Commons Attribution Licence 4.0.**

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