Accuracy of the Patient Health Questionnaire-9 for screening to detect major depression: updated systematic review and individual participant data meta-analysis

Zelalem F Negeri,[1,2] Brooke Levis,[3] Ying Sun,[1] Chen He,[1] Ankur Krishnan,[1] Yin Wu,[1,4] Parash Mani Bhandari,[1,2] Dipika Neupane,[1,2] Eliana Brehaut,[1] Andrea Benedetti,[2,5,6] Brett D Thombs,[1,2,4,5,7,8,9] on behalf of the Depression Screening Data (DEPRESSD) PHQ Group

For numbered affiliations see end of the article

Correspondence to: B D Thombs
brett.thombs@mcgill.ca
(ORCID 0000-0002-5644-8432)

ABSTRACT

OBJECTIVE
To update a previous individual participant data meta-analysis and determine the accuracy of the Patient Health Questionnaire-9 (PHQ-9), the most commonly used depression screening tool in general practice, for detecting major depression overall and by study or participant subgroups.

DESIGN
Systematic review and individual participant data meta-analysis.

DATA SOURCES
Medline, Medline In-Process, and Other Non-Indexed Citations via Ovid, PsycINFO, Web of Science searched through 9 May 2018.

REVIEW METHODS
Eligible studies administered the PHQ-9 and classified current major depression status using a validated semistructured diagnostic interview (designed for clinician administration), fully structured interview (designed for lay administration), or the Mini International Neuropsychiatric Interview (MINI; a brief interview designed for lay administration). A bivariate random effects meta-analytic model was used to obtain point and interval estimates of pooled PHQ-9 sensitivity and specificity at cut-off values 5-15, separately, among studies that used semistructured diagnostic interviews (eg, Structured Clinical Interview for Diagnostic and Statistical Manual), fully structured interviews (eg, Composite International Diagnostic Interview), and the MINI. Meta-regression was used to investigate whether PHQ-9 accuracy correlated with reference standard categories and participant characteristics.

RESULTS
Data from 44 503 total participants (27 146 additional from the update) were obtained from 100 of 127 eligible studies (42 additional studies; 79% eligible studies; 86% eligible participants). Among studies with a semistructured interview reference standard, pooled PHQ-9 sensitivity and specificity (95% confidence interval) at the standard cut-off value of ≥10, which maximised combined sensitivity and specificity, were 0.85 (0.79 to 0.89) and 0.85 (0.82 to 0.87), respectively. Specificity was similar across reference standards, but sensitivity in studies with semistructured interviews was 7-24% (median 21%) higher than with fully structured reference standards and 2-14% (median 11%) higher than with the MINI across cut-off values. Across reference standards and cut-off values, specificity was 0-10% (median 3%) higher for men and 0-12 (median 5%) higher for people aged 60 or older.

CONCLUSIONS
Researchers and clinicians could use results to determine outcomes, such as total number of positive screens and false positive screens, at different PHQ-9 cut-off values for different clinical settings using the knowledge translation tool at www.depressionscreening100.com/phq.

STUDY REGISTRATION
PROSPERO CRD42014010673.

WHAT IS ALREADY KNOWN ON THIS TOPIC

The Patient Health Questionnaire-9 (PHQ-9) is the most commonly used depression screening tool in primary and general settings, with cut-off value ≥10 used as a standard to identify major depression

A previous individual participant data meta-analysis on PHQ-9 accuracy for detecting major depression included 58 studies (17 357 participants) through February 2015 and found that the PHQ-9 had higher accuracy in comparison with semistructured reference standards than with other reference standards; older age of participants was significantly, although minimally, associated with higher specificity; combined sensitivity and specificity was maximised at the standard cut-off value of ≥10

WHAT THIS STUDY ADDS

Updated searches through May 2018 showed that overall sensitivity and specificity estimates were robust and consistent with previous estimates, even though the sample included an additional 42 studies (27 146 additional participants)

PHQ-9 specificity was slightly better when estimated among only participants confirmed as not already diagnosed or receiving treatment and who would be screened in practice

Across all possible cut-off values, for semistructured interviews, specificity was 0-12% (median 5%) higher for older participants, which contradicts assumptions that screening tools might be less accurate in elderly people

A knowledge translation tool (www.depressionscreening100.com/phq) based on the findings from this study can be used to generate screening outcomes for different cut-off values based on local assumptions about prevalence

Introduction

Depression accounts for more years of healthy life lost than any other medical condition.[1-4] Screening has been recommended to identify people with unrecognised depression by the United States Preventive Services Task Force[5] but not the Canadian Task Force on Preventive Health Care[6] or the UK National Screening Committee.[7] Depression symptom

questionnaires can be used for many purposes, including assessing and discussing symptoms with patients who might be unsure if they have depression, monitoring for treatment response or relapse detection, and depression screening.[8] Depression screening involves administering a questionnaire with a prespecified cut-off value to classify patients who have not been otherwise identified as possibly depressed as positive or negative screens and further assessing those with positive screens to determine whether major depression criteria are met.[8-13]

The nine item Patient Health Questionnaire-9 (PHQ-9)[14-16] is recommended for screening by the US Preventive Services Task Force and others.[11 17 18] Items, scored 0-3, reflect how often each of the nine Diagnostic and Statistical Manual (DSM) major depression symptoms[19-22] have bothered respondents in the past two weeks. The standard cut-off value for detecting major depression is ≥10.[14-16 23-25]

A previous individual participant data meta-analysis (IPDMA; 58 studies, 17 357 participants)[25] conducted by our collaboration compared PHQ-9 accuracy with semistructured diagnostic interviews, fully structured diagnostic interviews, and the Mini International Neuropsychiatric Interview (MINI), separately, owing to important differences in the characteristics and performance of different types of diagnostic interviews.[26-29] Semistructured interviews are designed for administration by trained clinicians to replicate clinical diagnostic procedures as closely as possible in a research setting, whereas fully structured interviews are designed for lay administration with no clinical judgment required.[30-33] The MINI is a brief, fully structured interview designed for rapid administration and to be overinclusive.[34 35] The previous IPDMA found that compared with semistructured interviews, PHQ-9 ≥10 had sensitivity of 0.88 (95% confidence interval 0.83 to 0.92), and specificity of 0.85 (0.82 to 0.88). A statistically significant, but minimal, difference in sensitivity by age was found, but no other differences by participant or study level subgroups.

Our objective was to update the previous PHQ-9 IPDMA, using an updated and larger dataset, to firstly, assess PHQ-9 screening accuracy compared with semistructured (primary analysis), fully structured (other than MINI), and MINI diagnostic interviews, separately, and, secondly, investigate accuracy by participant and study characteristic subgroups. In this update, we obtained data from 42 additional studies (27 146 participants) since our previous PHQ-9 IPDMA.[25]

Methods
The IPDMA was registered in PROSPERO international prospective register of systematic reviews (CRD42014010673), and a protocol was published.[36] We followed reporting guidance from Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) of diagnostic test accuracy[37] and PRISMA of individual participant data.[38] Methods were consistent with those of the previous IPDMA.[25]

Separate IDPMAs have been published for the PHQ-2[39] and PHQ-8.[40]

Study eligibility
Eligible datasets were sought from studies in any language that included diagnostic classification for current major depressive disorder or major depressive episode based on DSM[19-22] or ICD (international classification of diseases)[41] criteria, using a validated semistructured or fully structured interview conducted within two weeks of PHQ-9 administration, among participants aged 18 or older not recruited from youth or psychiatric settings or because they were already identified as having depression symptoms. Patients from psychiatric settings or those already identified as having depression symptoms were excluded because screening is carried out to identify patients with unrecognised depression.

Datasets where not all participants were eligible were included if primary data allowed selection of eligible participants. For defining major depression, if results from both DSM and ICD or both major depressive disorder and major depressive episode were provided, we prioritised DSM over ICD and prioritised major depressive episode over major depressive disorder. This procedure was followed because DSM classification was used in almost all studies and because screening is done to detect depressive episodes; additional interviews are needed to determine if an episode is related to major depressive disorder, bipolar disorder, or persistent depressive disorder.

Database searches and study selection
Initial and updated Medline, Medline In-Process, and Other Non-Indexed Citations via Ovid, PsycINFO, and Web of Science searches, using peer reviewed[42] search strategies (supplementary methods A), covered 1 January 2000, through February 2015 (initial search) and 9 May 2018 (updated search). The initial search began in 2000 because the PHQ-9 was published in 2001.[14] Additionally, reference lists of relevant reviews were searched, and contributing authors were queried about non-published studies. Search results were uploaded into RefWorks (RefWorks-COS, Bethesda, MD, USA), and, after deduplication, unique citations were uploaded into DistillerSR (Evidence Partners, Ottawa, Canada).

Two independent investigators reviewed titles and abstracts. If either investigator deemed a study potentially eligible, a full text review was carried out by two investigators independently with disagreements resolved by consensus, consulting a third investigator when necessary. Translators were consulted for languages other than those in which team members were fluent.

Data contribution, extraction, and synthesis
Deidentified primary data were requested from investigators with eligible datasets. Corresponding authors were sent up to three emails, as necessary. If not successful, we emailed coauthors and attempted

to contact corresponding authors by phone. Individual participant data that were obtained were transferred to a standard format and merged into a single dataset with study level data. Any discrepancies between published results and raw datasets were resolved in consultation with primary study investigators.

Two investigators independently extracted study level data, including country, recruitment setting (non-medical, primary care, inpatient, outpatient specialty), and diagnostic interview from published articles, consulting a third investigator and querying authors, if necessary. Based on the United Nations' human development index,[43] countries were categorised as "very high," "high," or "low-medium" development based on the index for the year of study publication. Participants' age, sex, major depression interview status, current mental health diagnosis or treatment, and PHQ-9 scores were included in participant level data. Recruitment setting was coded by participant, as two primary studies had more than one recruitment setting. If provided, we used weights from primary studies that implemented weighting to reflect sampling procedures. When primary studies were not weighted, but their sampling procedures warranted weighting, we calculated weights using inverse selection probabilities. Primary studies in which all participants with positive screens and a random subset of participants with negative screens were administered a diagnostic interview, for example, necessitated weighting.

Risk of bias assessment

We assessed risk of bias with the QUality Assessment of Diagnostic Accuracy Studies-2 (QUADAS-2) tool, applied by two investigators independently, based on reporting in primary publications. Discussion and consensus were used to resolve any discrepancies with a third investigator involved if necessary. Supplementary methods B present QUADAS-2 coding rules used in the study.[44]

Statistical analyses

Four different sets of analyses were performed. In the first set, we fitted bivariate random effects models to estimate PHQ-9 sensitivity and specificity across cut-off values ≥5 to ≥15 with 95% confidence intervals; we did this separately by studies that used semistructured (primary analysis; Structured Clinical Interview for DSM,[45] Schedules for Clinical Assessment in Neuropsychiatry,[46] Depression Interview and Structured Hamilton[47]), fully structured (Composite International Diagnostic Interview,[48] Clinical Interview Schedule-Revised,[49] Diagnostic Interview Schedule[50]), and MINI[34 35] diagnostic interviews.

In the second set of analyses, we fitted bivariate random effects models to estimate sensitivity and specificity across PHQ-9 cut-off values for only participants known not to be currently diagnosed or receiving treatment for a mental health problem compared with results among all participants. We used this method because, although the PHQ-9 can

be used for many purposes (eg, screening, monitoring symptoms during treatment, checking for relapse), screening is done to identify people with previously unrecognised major depression. Already diagnosed or treated patients are sometimes included in primary studies from non-mental health settings but would not be screened in practice.[51 52] Not all primary studies, however, provided data on which participants had previously identified depression, so we compared results with all participants versus results among participants we could confirm were not already diagnosed or receiving treatment. We used a clustered bootstrap approach to construct 95% confidence intervals for differences in sensitivity and specificity at cut-off values of 5-15 between participants not currently diagnosed or receiving treatment for a mental health problem versus all participants[53 54]; 1000 iterations of resampled data were used at the study and subject levels.

In the third set of analyses, we investigated differences in sensitivity and specificity between reference standard categories and participant subgroups using meta-regression. We fitted a one stage multiple meta-regression that interacted reference standard category (reference: semistructured) with PHQ-9 accuracy coefficients (logit(sensitivity) and logit(1–specificity)) and compared results with those obtained from the bivariate random effects model. We fitted additional multiple meta-regression models within each reference standard category by interacting PHQ-9 logit(sensitivity) and logit(1-specificity) with participant characteristics, including continuously measured age, sex (reference: women), country human development index (reference: very high), and participant recruitment setting (reference: primary care). We did not include medical comorbidity in the subgroup analysis because 18 316 of 44 503 (41%) participants did not have comorbidity data, and too few studies had data from single conditions (eg, cancer) to assess by condition. Similarly, there were insufficient studies across categories to analyse results by language or country.

In our fourth set of analyses, following recommendations by Kent et al,[55] we fitted bivariate random effects models among subgroups based on each participant characteristic significantly associated with sensitivity or specificity for all three reference standard categories across all or most cut-off values of 5-15 in the meta-regression models from the third set of analyses. For these analyses, age was dichotomised as less than 60 and 60 or older, as done previously.[25] Primary studies with no patients with major depression or none without depression were excluded in each subgroup analysis because the inclusion of such studies did not allow application of a bivariate random effects model.

For all analyses, bivariate random effects models that considered the correlation between test sensitivity and specificity were fitted to the PHQ-9 data using the Gauss-Hermite adaptive quadrature algorithm[56] and one quadrature point, which is equivalent to the Laplace approximation, to obtain overall sensitivity,

specificity, and associated 95% confidence intervals. We constructed empirical receiver operating characteristic curves for each reference standard based on pooled sensitivity and specificity estimates and calculated areas under the curve.

To quantify statistical heterogeneity across studies in each reference standard category and then separately across participant subgroups within each category, we generated forest plots of sensitivities and specificities. Although there are no well established methods to quantify levels of heterogeneity in meta-analyses of diagnostic test accuracy,[37 57] we quantified heterogeneity by reporting τ^2 (the estimated variances of the random effects for sensitivity and specificity), R (the ratio of the estimated standard deviation of the overall sensitivity (or specificity) from the random effects model to that from the corresponding fixed effects model),[58] and the 95% prediction intervals for the unknown sensitivity and specificity of a new study.

We used sensitivity and specificity estimates at the standard cut-off value ≥10 from our first set of analyses and hypothetical major depression prevalence values of 5-25% to generate nomograms to estimate positive and negative predictive values of the PHQ-9.

As a sensitivity analysis, we fitted multiple meta-regression models based on QUADAS-2 signalling questions for each reference standard category to compare accuracy of results between subgroups based on risk of bias. For these analyses, QUADAS-2 signalling questions were interacted with logit(sensitivity) and logit(1−specificity) for all these questions with a minimum of 100 participants with major depression and 100 without depression among studies categorised as "low" risk of bias versus "high" or "unclear" risk of bias. As an additional sensitivity analysis, we also assessed the effects on the main IPDMA results of including data from eligible studies that did not contribute data but published eligible accuracy data.

We employed R[59] version 4.0.0 and RStudio[60] version 1.2.5042 to run all analyses using the *glmer* function within the *lme4*[61] R package.

Patient and public involvement
No patients were involved in developing the research question, outcome measures, or study design. Since study inception, Dr Sarah Markham joined the DEPRESSD Group as a patient collaborator. She reviewed the draft manuscript.

Results
Search results and dataset inclusion
A total of 9670 unique titles and abstracts were identified from database searches, including the initial and updated searches; 9199 were excluded at the title and abstract review stage and 297 after full text review (supplementary table A), which left 174 articles meeting eligibility criteria. Of these, 56 had duplicate samples. Of the remaining 118 studies, 91 (77%) provided participant data. Nine additional unpublished studies were contributed by authors, which resulted in a total of 100 included studies

that provided participant data (number of participants 44 503; number with major depression 4541 (prevalence 10%; fig 1). Of these, 42 studies with 27 146 participants were from the updated search. Supplementary table B shows characteristics of included primary studies and eligible studies that did not provide data.

Table 1 shows participant data by reference standard. Of the 100 included studies, 47 (11 234 participants; 1528 with major depression) used a semistructured interview, 20 (17 167 participants; 1352 major depression) a fully structured interview (other than the MINI), and 33 (16 102 participants; 1661 major depression) the MINI. The Structured Clinical Interview for DSM was the most used semistructured interview (44 of 47 studies), and the Composite International Diagnostic Interview the most used fully structured interview (17 of 20 studies). Table 2 displays participant data by subgrouping variables.

PHQ-9 sensitivity and specificity by reference standard category
Estimates of PHQ-9 sensitivity and specificity for each reference standard category are given in table 3. Cut-off scores of ≥10, ≥8, and ≥8 maximised combined sensitivity and specificity for semistructured, fully structured (excluding MINI), and MINI reference standards, respectively. At the standard cut-off value of ≥10, sensitivity estimates (95% confidence interval) were 0.85 (0.79 to 0.89) for semistructured, 0.64 (0.53 to 0.74) for fully structured, and 0.74 (0.67 to 0.79) for MINI reference standards; corresponding specificity estimates (95% confidence interval) were 0.85 (0.82 to 0.87), 0.88 (0.83 to 0.92). and 0.89 (0.86 to 0.91), respectively. PHQ-9 sensitivity, across all cut-off values, when compared with a semistructured reference standard was 7-24% (median 21%) higher than with fully structured reference standards, and 2-14% (median 11%) higher than with the MINI. PHQ-9 specificity was similar across cut-off values and reference standards. Figure 2 shows receiver operating characteristic plots and area under the curve for each reference standard. Area under the curve was highest when the PHQ-9 was compared with semistructured interviews (0.90), followed by the MINI (0.88) and other fully structured (0.84) reference standards.

Heterogeneity between studies varied from moderate to large, although it was diminished for some subgroups (forest plots: supplementary fig A; τ^2, R, and prediction intervals: supplementary table C). For cut-off value ≥10, τ^2 values ranged from 0 to 6.97 for sensitivity and 0 to 1.65 for specificity for semistructured interviews, 0.32 to 1.28 for sensitivity and 0.32 to 1.48 for specificity for fully structured interviews (MINI excluded), and 0.21 to 1.44 for sensitivity and 0.07 to 0.71 for the MINI. The 95% prediction intervals for sensitivity and specificity were much wider than the corresponding 95% confidence intervals in supplementary table E, similarly reflecting the moderate to high heterogeneity between studies.

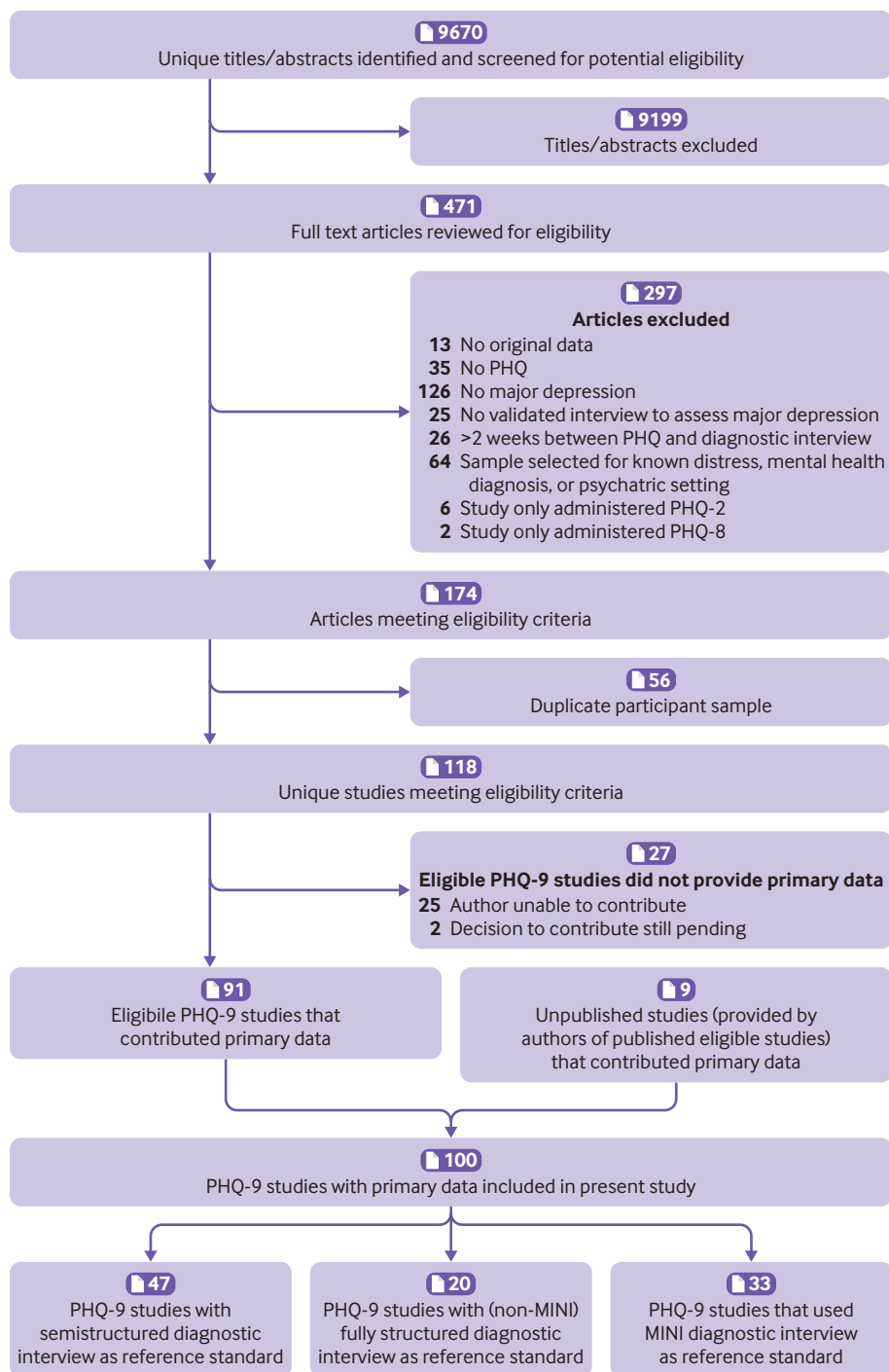Nomograms for positive and negative predictive values of the PHQ-9 for hypothetical major depression

Fig 1 | Flow diagram of study selection process. MINI=Mini International Neuropsychiatric Interview; PHQ=Patient Health Questionnaire

prevalence values of 5-25% at a cut-off score of ≥10 are presented in figure 3. For these theoretical prevalence values, positive predictive values ranged from 23% to 65% for semistructured interviews, 22% to 64% for fully structured interviews, and 26% to 69% for the MINI; corresponding negative predictive values were 94% to 99%, 88% to 98%, and 91% to 99%, respectively.

Multiple meta-regression results showing the association between PHQ-9 accuracy and the

three reference standard categories are shown in supplementary table D. Significant associations were found between reference standards and PHQ-9 sensitivity across cut-off values of 5-15. Compared with semistructured interviews, sensitivity was 5-23% (median 19%) higher than with fully structured interviews and 1-15% (median 10%) higher than with the MINI. Across cut-off values, the magnitude of estimated differences based on meta-regression were within 2-3% of difference estimates based on the

Table 1 | Distribution of participant data by diagnostic interview

Diagnostic interview	Studies (No)	Participants (No)	Major depression (No (%))
Semistructured:	47	11 234	1528 (14)
Structured Clinical Interview for DSM	44	9242	1389 (15)
Schedules for Clinical Assessment in Neuropsychiatry	2	1892	130 (7)
Depression Interview and Structured Hamilton	1	100	9 (9)
Fully structured:	20	17 167	1352 (8)
Composite International Diagnostic Interview	17	15 759	1067 (7)
Diagnostic Interview Schedule	1	1006	221 (22)
Clinical Interview Schedule-revised	2	402	64 (16)
Mini International Neuropsychiatric Interview	33	16 102	1661 (10)
Total	100	44 503	4541 (10)

DSM=Diagnostic and Statistical Manual.

bivariate random effects model. The maximum number of participants excluded from any subgroup analysis because a study had no patients with or without major depression was 63.

Among the 27 studies that did not contribute individual participant data, 13 published eligible accuracy data (supplementary table B2). Six used semistructured interviews, two fully structured interviews, and five the MINI, although two of the semistructured studies were excluded from the sensitivity analysis because they did not publish the number of participants with or without major depressive disorder. Including published results from the remaining 11 studies did not change results as shown in supplementary tables D14 to D16.

PHQ-9 accuracy among participants not diagnosed or receiving treatment for a mental health problem compared with all participants

Sensitivity estimates for participants not diagnosed or receiving treatment were not significantly different than those for all participants for any reference standard category. Specificity estimates were statistically significantly different for semistructured and MINI interviews. Among participants not currently diagnosed or receiving treatment compared with all participants, specificity was 1-4% (median 4%) higher across cut-off values with semistructured interviews and 1-6% (median 3%) higher across cut-off values with the MINI (supplementary table E). Specificity was not significantly different for fully structured interviews.

PHQ-9 sensitivity and specificity among subgroups and risk of bias

Meta-regression results interacting PHQ-9 sensitivity and specificity with reference standards and then with other subgroup variables stratified within reference standards are shown in supplementary table D. Pooled sensitivity and specificity and associated 95% confidence intervals for cut-off values 5-15 by reference standard and subgrouping variables are presented in supplementary table E. Receiver operating characteristic curves and corresponding areas under the curve are shown in supplementary figure B.

Table 2 | Distribution of participant data by subgroup*

Participant subgroup	Semistructured diagnostic interviews			Fully structured diagnostic interviews			Mini International Neuropsychiatric Interview		
	Studies (No)	Participants (No)	Major depression No (%)	Studies (No)	Participants (No)	Major depression No (%)	Studies (No)	Participants (No)	Major depression No (%)
All participants	47	11 234	1528 (14)	20	17 167	1352 (8)	33	16 102	1661 (10)
Participants not currently diagnosed or receiving treatment for a mental health problem	26	3687	603 (16)	5	4001	289 (7)	15	8365	578 (7)
Age <60 years	42	7349	1131 (15)	20	13 784	1087 (8)	31	10 489	1119 (11)
Age ≥60 years	39	3860	397 (10)	15	3374	265 (8)	27	5585	533 (10)
Women	46	6986	1040 (15)	20	9603	793 (8)	32	9574	1126 (12)
Men	39	4168	488 (12)	18	7554	557 (7)	30	6511	534 (8)
Country with very high human development index	38	9156	1047 (11)	16	15 422	1149 (7)	21	10 484	1108 (11)
Country with high human development index	5	811	215 (27)	0	0	0	7	3753	237 (6)
Country with low or medium human development index	4	1267	266 (21)	4	1745	203 (12)	5	1865	316 (17)
Non-medical care	2	567	105 (19)	4	8219	371 (5)	9	7802	117 (15)
Primary care	14	4566	683 (15)	7	4746	425 (9)	9	5063	543 (11)
Inpatient specialty care	12	2355	257 (11)	2	593	72 (12)	3	473	106 (22)
Outpatient specialty care	21	3746	483 (13)	7	3609	484 (13)	12	2634	511 (19)

*Some variables were coded at the study level, while others were coded at the participant level. Thus, the number of studies does not always add up to the total for each reference standard.

Table 3 | Comparison of sensitivity (95% confidence interval) and specificity (95% confidence interval) estimates among semistructured, full structured, and MINI reference standards

Cut-off score	Semi structured reference standard*		Fully structured reference standard†		MINI reference standard‡	
	Sensitivity (95% CI)	Specificity (95% CI)	Sensitivity (95% CI)	Specificity (95% CI)	Sensitivity (95% CI)	Specificity (95% CI)
5	0.98 (0.95 to 0.99)	0.53 (0.49 to 0.58)	0.91 (0.85 to 0.95)	0.61 (0.51 to 0.69)	0.96 (0.93 to 0.97)	0.60 (0.55 to 0.64)
6	0.97 (0.94 to 0.98)	0.61 (0.57 to 0.65)	0.88 (0.80 to 0.93)	0.69 (0.60 to 0.76)	0.92 (0.89 to 0.95)	0.68 (0.63 to 0.72)
7	0.95 (0.92 to 0.98)	0.68 (0.64 to 0.72)	0.82 (0.73 to 0.89)	0.75 (0.67 to 0.82)	0.88 (0.83 to 0.92)	0.74 (0.70 to 0.78)
8	0.92 (0.88 to 0.95)	0.74 (0.70 to 0.77)	0.77 (0.66 to 0.86)	0.81 (0.74 to 0.86)	0.85 (0.79 to 0.89)	0.80 (0.76 to 0.83)
9	0.89 (0.84 to 0.92)	0.80 (0.76 to 0.82)	0.69 (0.59 to 0.78)	0.85 (0.79 to 0.90)	0.80 (0.73 to 0.85)	0.85 (0.82 to 0.88)
10	0.85 (0.79 to 0.89)	0.85 (0.82 to 0.87)	0.64 (0.53 to 0.74)	0.88 (0.83 to 0.92)	0.74 (0.67 to 0.79)	0.89 (0.86 to 0.91)
11	0.81 (0.75 to 0.86)	0.88 (0.85 to 0.90)	0.57 (0.46 to 0.67)	0.91 (0.87 to 0.94)	0.67 (0.60 to 0.73)	0.91 (0.89 to 0.93)
12	0.75 (0.69 to 0.80)	0.90 (0.88 to 0.92)	0.52 (0.41 to 0.63)	0.93 (0.89 to 0.95)	0.61 (0.54 to 0.68)	0.93 (0.91 to 0.95)
13	0.67 (0.61 to 0.72)	0.93 (0.91 to 0.94)	0.45 (0.35 to 0.56)	0.95 (0.92 to 0.97)	0.55 (0.47 to 0.62)	0.95 (0.93 to 0.96)
14	0.61 (0.55 to 0.67)	0.94 (0.93 to 0.96)	0.39 (0.30 to 0.50)	0.96 (0.94 to 0.97)	0.47 (0.41 to 0.54)	0.96 (0.95 to 0.97)
15	0.52 (0.46 to 0.58)	0.96 (0.94 to 0.97)	0.32 (0.24 to 0.41)	0.97 (0.95 to 0.98)	0.40 (0.35 to 0.46)	0.97 (0.96 to 0.98)

MINI=Mini International Neuropsychiatric Interview.
*Number of studies=47; number of participants=11 234; number of participants with major depression=1528.
†Number of studies=20; number of participants=17 167; number of participants with major depression=1352.
‡Number of studies=33; number of participants=16 102; number of participants with major depression=1661.

The age and sex of participants, but no other variables, were statistically significantly associated with specificity in all three reference standard categories (supplementary table D). Specificity was higher for participants aged 60 or older than for younger participants. It was 2-12% (median 6%) higher with semistructured interviews, 3-11% (median 6%) higher for fully structured interviews, and 0-8% (median 2%) higher for the MINI; across reference standards, it was 0-12% (median 5%). Specificity was also higher for men than women. Differences from the meta-regression were 1-10% (median 4%), 1-7% (median 3%), and 0-7% (median 3%) for semistructured, fully structured, and the MINI reference standards, respectively; across reference standards, it was 0-10% (median 3%). For age and sex,

magnitudes of differences based on meta-regression were within 1-5% of difference estimates based on the bivariate random effects meta-analytic model.

Based on results from studies with semistructured interviews, the cut-off value that maximised combined sensitivity and specificity shifted slightly from ≥10 for some subgroups. By age, the maximum was obtained with a cut-off value of ≥11 for age less than 60 and ≥10 for age 60 or older. By sex, it was ≥11 for women and ≥9 for men. However, in all instances, these maximum values were within 1-2% of those obtained with a cut-off value of ≥10. Results were similar for fully structured interviews and the MINI (supplementary table E).

QUADAS-2 ratings for all included primary studies are presented in supplementary table F. Of 395 study level items, 12 were rated as high, 130 as unclear, and 253 as low risk of bias. No QUADAS-2 signalling questions were consistently associated with PHQ-9 sensitivity or specificity, as shown in supplementary table D.

Discussion

Principal findings

We evaluated PHQ-9 accuracy for screening for major depression. We found that combined PHQ-9 sensitivity (85%) and specificity (85%) was maximised at the standard cut-off value of ≥10 among studies using a semistructured interview, which is the interview type designed to replicate diagnostic procedures most closely. When only participants not already diagnosed or receiving treatment were considered, which reflects the population that would be screened in practice, sensitivity was unchanged at a cut-off value ≥10, whereas specificity improved to 89%.

Age and sex were statistically significantly associated with PHQ-9 specificity in all three types of diagnostic interviews. The PHQ-9 was more specific for participants aged 60 or older than for younger participants and for men than for women. Sensitivity was not associated with age or sex. Differences in accuracy by subgroups resulted in different cut-off values that maximised combined sensitivity and
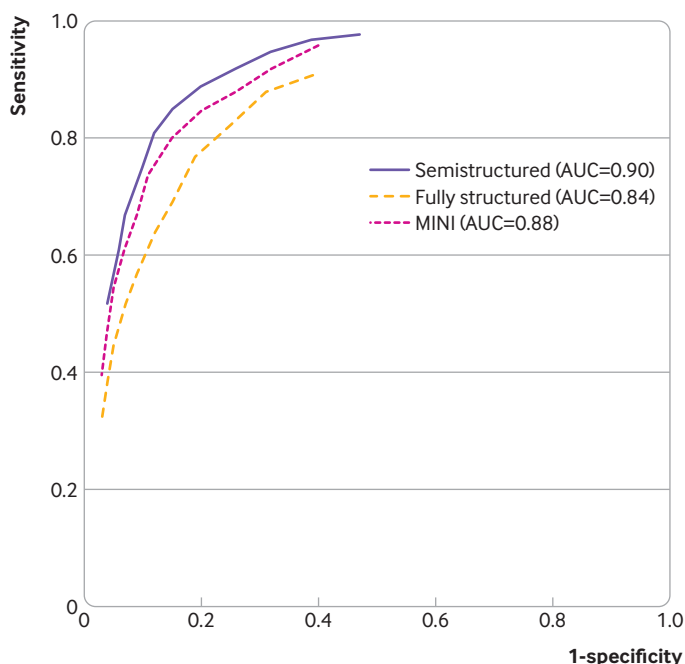

Fig 2 | Receiver operating characteristic curves showing estimates of sensitivity and specificity at each cut-off value and each reference standard category. AUC=area under the curve; MINI=Mini International Neuropsychiatric Interview
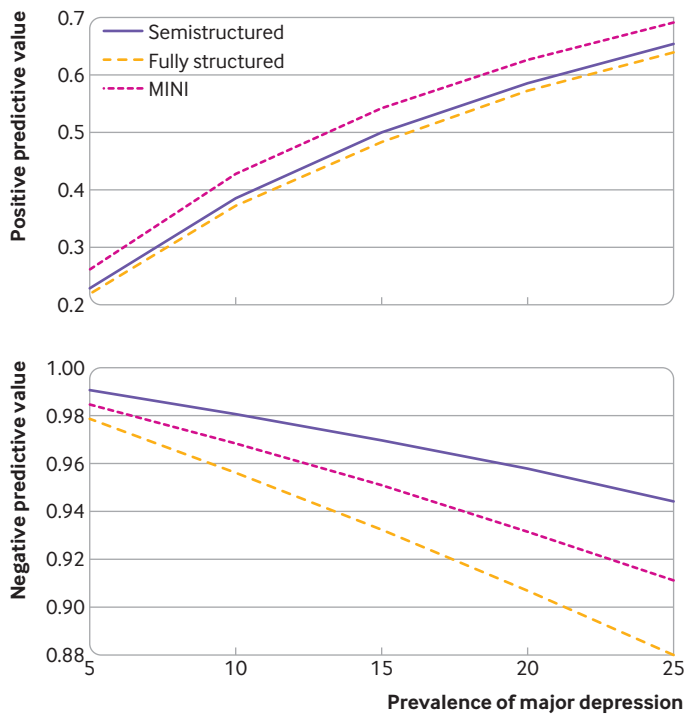
Fig 3 | Nomograms of positive and negative predictive values for cut-off score 10 of the Patient Health Questionnaire-9 for major depression prevalence values of 5-25% for semistructured, fully structured, and MINI diagnostic interviews. MINI=Mini International Neuropsychiatric Interview

specificity in some subgroups, but the margin of difference compared with the standard cut-off value of ≥10 was minimal in all instances and not large enough to warrant the use in practice of different cut-off values for patients with different demographic characteristics.

Comparison with other studies

This IPDMA included data from almost twice as many primary studies and from approximately two and a half times as many participants as the previous PHQ-9 IPDMA.[25] Many results were similar. In both studies, sensitivity was substantially higher in comparison with a semistructured reference standard than for fully structured and MINI reference standards. This finding is consistent with findings that compared with semistructured interviews, fully structured and MINI reference standards generate a substantial number of false positive diagnoses, controlling for participant and study characteristics[26-29]; the additional diagnoses that are generated would be expected to result in lower sensitivity of the PHQ-9 to detect people with major depression, which we found to be the case. Sensitivity and specificity were maximised at a cut-off score of ≥10 among studies using a semistructured interview. Older age was associated with significantly, although minimally, greater specificity across reference standards for most cut-off values, a finding which contradicts assumptions that screening tools might be less accurate in elderly people and suggests that the PHQ-9 is similarly or more accurate.

In contrast to the previous IPDMA, we found that PHQ-9 specificity might be higher for men than for women across reference standards. We also found that specificity was significantly higher when only data from participants not diagnosed or receiving treatment for a mental health problem were examined among studies using a semistructured or the MINI reference standard; based on studies with semistructured interviews, it was approximately four percentage points higher. Previous studies[51 52] have predicted that inclusion of such participants might bias accuracy results, although those studies suggested that the bias would probably be through improved sensitivity. Instead, we found that specificity was reduced when people who might have already been diagnosed or in treatment were considered, suggesting that false positive screens occurred in this group. Magnitude of bias was small, however, and this result was not seen among studies that administered fully structured interviews.

Implications

Many studies report the cut-off value that maximises combined sensitivity and specificity, and we did this in the present study to establish a reference point. There is no clinical reason, however, for selecting a cut-off value based on this standard for use in clinical trials or practice. Higher cut-off values would rule out more participants without depression but would detect fewer participants who meet the criteria for major depression. Conversely, lower cut-off values would detect more participants who met diagnostic criteria at the expense of more false positive screens among people without major depression. Ideally, clinical decision making would consider the benefits versus the costs and harms that are generated from correct and incorrect screening results and the expected net benefit or costs and harms at all possible cut-off values.[62] Selecting a cut-off value in this way depends on local values and resources, as well as assumptions about outcomes from positive and negative screening tests at different cut-off values.

Ideally, clinical trials could inform researchers and practitioners about outcomes from using different cut-off values. To the best of our knowledge, however, only one depression screening trial[59] has randomised participants to screening and no-screening groups and used the PHQ-9 or the eight item PHQ-8, which performs virtually identically,[40] to identify participants with possible depression. Kronish et al[63] used a cut-off value of ≥10 on the PHQ-8 to assign participants with an acute coronary syndrome in the past 12 months to notification of primary care clinicians of screening results, notification of clinicians plus stepped depression care, or usual care with no notification. People already receiving depression treatment were excluded. Only 7% of participants, however, had positive screening tests at the standard cut-off value of ≥10; fewer than 40 patients with positive screens were found in each intervention arm, some of whom might not have completed offered interventions, and results did not show benefit from screening. The small number of positively screened participants who could have been offered an intervention, however, makes it difficult to draw conclusions about the

appropriateness of the cut-off value. One might suggest that a lower cut-off value could have been used to increase positive screens and, potentially, patients with depression, but this would also have resulted in more false positive screens and a heavier assessment burden as the resources consumed by unnecessary assessment (typically by a mental health professional, depending on the setting) divert scarce resources that might otherwise be used for intervention. Furthermore, it is possible that if the number of true positive screens had been increased, those patients might have been people with mild symptoms who are less likely to benefit from intervention. Another possibility would be to increase the cut-off threshold, which would require more participants to be screened in a trial; an obvious disadvantage would be the sheer number of people who would have to be screened to identify those eligible for intervention.

Thus there are no easy answers for selection of the most appropriate cut-off value, and researchers and clinicians who wish to screen with the PHQ-9 will need to examine its likely performance at different cut-off values. To help clinicians do this, we have created a web-based tool (depressionscreening100.com/phq) based on this study's findings. The tool estimates the expected numbers of positive and negative screens and true and false screening results based on different assumed prevalence and different cut-off values (box 1).

Strengths and limitations

Strengths of our IPMDA method for evaluating PHQ-9 accuracy, compared with conventional meta-analyses, include (a) integration of data from studies that collected PHQ-9 and reference standard data but did not publish accuracy results; (b) inclusion of data from eligible participants in studies that included some eligible and some ineligible participants (eg, those already receiving mental healthcare) by selecting eligible participants only; (c) inclusion of studies that published results based on composite reference standards (eg, any psychiatric disorder) by coding based on the presence of major depression; (d) the ability to conduct subgroup analyses by participant or study characteristics; few primary studies have attempted subgroup analyses because of the amount of data required; and (e) the ability to conduct analyses for all relevant cut-off values for all included studies and reduce bias from selective cut-off value reporting, which occurs because many studies report results for only some cut-off values, often those with the most positive results.[64 65] The present IPDMA included data from 44 503 participants an increase of 27 146 from our previous IPDMA (N=17 357).[25]

This study has some limitations. Firstly, we could not include data from 27 of 127 eligible studies (21%; 14% of eligible participants), although including data from eligible studies that published sensitivity and specificity but did not contribute data did not change the IPDMA results. Secondly, there was substantial heterogeneity, although this was reduced somewhat in subgroup analyses. Methods for estimating and interpreting heterogeneity in meta-analyses of test accuracy are not well established, and there are no established guidelines for interpretating results of the quantitative metrics we used. High heterogeneity in meta-analyses of test accuracy studies is common.[37 57] Thirdly, because 41% of participants had missing medical comorbidity data, and most languages and countries were represented by few studies, we could not conduct those subgroup analyses. Fourthly, primary studies were classified according to the diagnostic interview used, but interviewers might not have always administered the interviews as intended, which could have influenced results. Fifthly, because of the time required to determine whether datasets used in published studies are eligible; to invite authors to participate; to arrange for data transfer, including data transfer agreements; and to conduct quality control and data harmonisation procedures, studies included in the IPDMA were published up to May 2018, and more recent studies could not be included.

Conclusions

We found that PHQ-9 sensitivity and specificity were both 85% compared with semistructured interviews. Sensitivity was unchanged, but specificity was higher (89%) when only people eligible for screening in practice were considered. Specificity appears to be higher for participants aged 60 or older and for men, but differences are not large enough to consider subgroup specific cut-off value thresholds. Clinicians who use the PHQ-9 to screen should select a cut-off point that provides the best balance of their preferences and resources for sensitivity and specificity and true and false positive screens.

AUTHOR AFFILIATIONS

[1]Lady Davis Institute for Medical Research, Jewish General Hospital, Montréal, QC, Canada

[2]Department of Epidemiology, Biostatistics and Occupational Health, McGill University, Montréal, WC, Canada

[3]Centre for Prognosis Research, School of Medicine, Keele University, Keele, UK

[4]Department of Psychiatry, McGill University, Montréal, QC, Canada

[5]Department of Medicine, McGill University, Montréal, QC, Canada

[6]Respiratory Epidemiology and Clinical Research Unit, McGill University Health Centre, Montréal, QC, Canada

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Box 1: Putting results into practice

- Standard cut-off points that are commonly used for depression screening, including the cut-off value of ≥10 on the Patient Health Questionnaire-9, are typically selected because they maximise combined sensitivity and specificity
- Maximising sensitivity and specificity, however, does not necessarily maximise the likelihood of patient benefits, minimise costs and harms, or reflect local concerns, such as capacity for conducting assessments of people with positive screens
- Researchers and clinicians can choose a cut-off value based on clinical priorities and local resources by comparing screening outcomes that would occur with different outcomes, including true and false positive screens and true and false negative results
- A knowledge translation tool (www.depressionscreening100.com/phq) based on the findings from this study can be used to generate screening outcomes for different cut-off values based on local assumptions about prevalence

[7]Department of Psychology, McGill University, Montréal, QC, Canada

[8]Department of Educational and Counselling Psychology, McGill University, Montréal, QC, Canada

[9]Biomedical Ethics Unit, McGill University, Montréal, QC, Canada

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Web appendix 1: Supplementary material

Web appendix 2: Depression Screening Data (DEPRESSD) PHQ Group members

Web appendix 3: Funding of primary studies