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Ultrasonographic criteria in the diagnosis of polycystic ovary syndrome: a systematic review and diagnostic meta-analysis

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GRAPHICAL ABSTRACT



Systematic review and diagnostic meta-analysis supports follicle number per ovary (FNPO) as the most accurate ovarian ultrasound marker in the diagnosis of PCOS.

ABSTRACT

BACKGROUND: Polycystic ovary morphology (PCOM) on ultrasonography is considered as a cardinal feature of polycystic ovarian syndrome (PCOS). Its relevance as a diagnostic criterion for PCOS was reaffirmed in the most recent International Evidence-Based Guideline for the Assessment and Management of PCOS. However, there remains a lack of clarity regarding the best practices and specific ultrasonographic markers to define PCOM.

OBJECTIVE AND RATIONALE: The aim of this systematic review and diagnostic meta-analysis was to assess the diagnostic accuracy of various ultrasonographic features of ovarian morphology in the diagnosis of PCOS.

SEARCH METHODS: Relevant studies published from 1 January 1990 to 12 June 2023 were identified by a systematic search in PubMed, Web of Science, Scopus, CINAHL, and CENTRAL. Studies that generated diagnostic accuracy measures (e.g. proposed thresholds, sensitivity, specificity) for PCOS using the following ultrasonographic markers met criteria for inclusion: follicle number per ovary (FNPO) or per single cross-section (FNPS), ovarian volume (OV), and stromal features. Studies on pregnant or post-menopausal women were excluded. Risk of bias and applicability assessment for diagnostic test accuracy studies were determined using the QUADAS-2 and QUADAS-C tool for a single index test or between multiple index tests, respectively. Diagnostic meta-analysis was conducted using a bivariate model of pooled sensitivity and specificity, and visualized using forest plots and summary receiver-operating characteristic (SROC) curves.

OUTCOMES: From a total of 2197 records initially identified, 31 studies were included. Data from five and two studies were excluded from the meta-analysis due to duplicate study populations or limited data for the index test, leaving 24 studies. Pooled results of 20 adult studies consisted of 3883 control participants and 3859 individuals with PCOS. FNPO was the most accurate diagnostic marker (sensitivity: 84%, CI: 81–87%; specificity: 91%, CI: 86–94%; AUC: 0.905) in adult women. OV and FNPS had similar pooled sensitivities (OV: 81%, CI: 76–86%; FNPS: 81%, CI: 70–89%) but inferior pooled specificities (OV: 81%, CI: 75–86%; FNPS: 83%, CI: 75–88%) and AUCs (OV: 0.856; FNPS: 0.870) compared to FNPO. Pooled results from four adolescent studies consisting of 210 control participants and 268 girls with PCOS suggested that OV may be a robust ultrasonographic marker for PCOS diagnosis albeit the current evidence remains limited. The majority of the studies had high risk of bias for the patient selection (e.g. lack of randomized/consecutive patient selection) and index test (e.g. lack of pre-proposed thresholds for comparison) domains across all ultrasonographic markers. As such, diagnostic meta-analysis was unable to determine the most accurate cutoff for ultrasonographic markers to diagnose PCOS. Subgroup analysis suggested that stratification based on previously proposed diagnostic thresholds, age, BMI, or technology did not account for the heterogeneity in diagnostic accuracy observed across the studies. Studies that diagnosed PCOS using the Rotterdam criteria had improved sensitivity for FNPO. Studies from North America had lower diagnostic accuracy when compared to Asian studies (FNPO: sensitivity) and European studies (OV: specificity, diagnostic odds ratio and positive likelihood ratio). Geographic differences in diagnostic accuracy may potentially be due to differences in age, BMI, and diagnostic criteria of the PCOS group across regions.

WIDER IMPLICATIONS: This diagnostic meta-analysis supports the use of FNPO as the gold standard in the ultrasonographic diagnosis of PCOS in adult women. OV and FNPS provide alternatives if total antral follicle counts cannot be accurately obtained. Our findings support the potential for ultrasonographic evidence of PCOM in adolescents as more data becomes available. Subgroup analysis suggests the need to investigate any relative contributions of geographical differences on PCOS phenotypes. These findings may provide the basis for the development of strategies and best practices toward a standardized definition of PCOM and a more accurate ultrasonographic evaluation of PCOS.

Keywords: ultrasonography / polycystic ovary syndrome / ovary / ovarian follicle / diagnostic imaging

Introduction

Polycystic ovary syndrome (PCOS) is a complex endocrine disorder that impacts up to 13% of women of reproductive age, as a leading cause of anovulatory infertility (Azziz et al., 2016). Symptoms and signs of PCOS include a combination of biochemical, clinical, and morphological indicators of androgen excess and ovulatory dysfunction (Teede et al., 2018a). In particular, polycystic ovary morphology (PCOM) was established as a key feature of PCOS since the earliest descriptions of the condition (Stein and Leventhal, 1935). PCOM is commonly evaluated using pelvic ultrasonography and described as an ovarian enlargement (i.e. increased ovarian volume (OV)) and/or an excess of small antral follicles, either within the entire ovary (FNPO) or within a single cross-sectional image (FNPS) (Dewailly et al., 2014b). Other morphological features, including the peripheral organization of follicles within the ovary and the echogenicity and relative abundance of the ovarian stroma, have been investigated in the context of PCOS but their utility to define PCOM is less defined (Christ et al., 2014; Dewailly et al., 2014b). Despite its namesake, controversy has persisted surrounding the relevance of PCOM to serve as a diagnostic criterion for PCOS due to factors such as its prevalence in regular cycling women (Johnstone et al., 2010; Kristensen et al., 2010), the emphasis on biochemical or clinical assessments of PCOS by previous consensus diagnostic criteria (Zawadski and Dunaif, 1992; Azziz et al., 2006), as well as a lack of standardization across methodology and technology used to assess and define PCOM (Dewailly et al., 2014b).

In 2018, the International Evidence-based Guideline for the Assessment and Management of PCOS reaffirmed the inclusion of PCOM in its recommended diagnostic criteria for PCOS (Teede et al., 2018a). However, the authors noted that evidence-based recommendations to define PCOM were not available and further research to comprehensively assess its diagnostic performance in detecting PCOS was needed (Teede et al., 2018b).

Therefore, the primary purpose of this systematic review and meta-analysis was to evaluate the diagnostic accuracy of ultrasonographic ovarian markers in the diagnosis of PCOS. In addition, a secondary aim was to identify potential strategies and best practices that would work toward a standardized definition of PCOM.

Methods

The systematic review was conducted in accordance to the Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) guidelines for Diagnostic Test Accuracy (McInnes et al., 2018). The PICO criteria were defined before the literature search and detailed in Supplementary Table S1. Concisely, our study question was, in comparing women with or without PCOS (P), what is the most accurate ultrasonographic criteria (I) to diagnose PCOS (O)?

The study protocol was registered and is available at the International Prospective Register of Systematic Reviews (PROSPERO) (Registration ID: CRD42021259118).

Search strategy

A systematic search of published literature was initially conducted in the electronic databases of MEDLINE, Institute for Scientific Information (ISI) Web of Science, Scopus, Cochrane Central Register of Controlled Trials (CENTRAL), and Cumulative Index to Nursing and Allied Health Literature (CINAHL) from 31 December 2020 through 8 January 2021 using a search strategy based on the PICO framework (Supplementary Table S1). The search was continuously updated to identify the newest relevant studies until 12 June 2023. Details of the search strategy are available (Supplementary Table S2). Further, manual searches of the reference list of included studies supplemented the electronic database searches. Non-English studies, animal studies, or studies published before 1990 were excluded. The last adjustment was chosen to allow the inclusion of studies where the PCOS diagnosis was compiled by the 1990 NIH (Zawadski and Dunaif, 1992), 2003 Rotterdam (The Rotterdam ESHRE/ASRM-Sponsored PCOS Consensus Workshop Group, 2004), 2006 Androgen Excess and PCOS Society (AE-PCOS) (Azziz et al., 2006), or 2018 International Guideline (Teede et al., 2018a) criteria.

Study selection

Studies were included if they met the PICO criteria described in Supplementary Table S1. Briefly, observational (cross-sectional, case-control, cohort) studies or cross-sectional analysis of baseline measures from non-randomized or randomized control trials on women of reproductive age with and without PCOS were included wherein transvaginal (adult) or transabdominal/transrectal (adolescent) ultrasonographic markers were used in the diagnosis of PCOS. Adult women were defined as individuals between 18 and 50 years old. Adolescent girls were defined as individuals <20 years old and at least 1-year post-menarche in line with the recommendations from the 2018 International Guideline (Teede *et al.*, 2018a; Peña *et al.*, 2020).

Systematic reviews, evidence-based guidelines, non-peerreviewed studies, case series, and animal studies were excluded. In addition, studies fulfilling the following criteria were excluded: studies limited to pregnant and post-menopausal (>50 years old) women; studies wherein the diagnosis of PCOS did not comply with the NIH, Rotterdam, AE-PCOS, or International Guideline criteria; studies that exclusively used other imaging methods, such as MRI or computerized tomography (CT); and studies where data were irretrievable after contacting their corresponding authors. Our primary outcome was diagnostic test accuracy measures (i.e. proposed thresholds, sensitivity, specificity, AUC) of the following ultrasound ovarian markers: follicle number per whole ovary (FNPO) or within a single cross-section/slice (FNPS), OV, and stromal features. Proposed thresholds were defined as those recommended by authors based on their chosen methodology (e.g. Youden's index in ROC analysis, 95th percentile of a healthy population, previously recommended thresholds). The screening process was completed by four investigators (J.P., J.B., C.W., and K.G.) independently using the double-blind coding assignment function of the online Covidence systematic review platform (Covidence.org, Alfred Health, Melbourne, Australia) and Excel. Review of all citations identified by the search strategy was conducted first by title and abstract followed by full text to determine eligibility. All discrepancies were resolved by consensus with an additional investigator (M.E.L.).

Risk of bias and applicability assessment

Methodological quality items and types of bias were evaluated using the Quality Assessment of Diagnostic Accuracy Studies (QUADAS-2) tool and the QUADAS-C. QUADAS-2 is a validated tool developed specifically for primary diagnostic accuracy studies that addresses four domains: patient selection, index test, reference standard, and flow and timing (Whiting *et al.*, 2011). The first three domains are also assessed for applicability concerns. Risk of bias and applicability concerns are scored as 'low', 'high', or 'unclear'. QUADAS-C is an extension tool used to assess risk of bias between multiple index tests that are compared within diagnostic accuracy studies (Yang *et al.*, 2021). Three investigators (J.P., A.L.O., and C.W.) independently evaluated the included studies, with any discrepancies being resolved through consensus or discussion with an additional investigator (M.E.L.).

Data extraction

The following data were extracted using a standardized protocol, including: (i) first author's name; (ii) study publication year; (iii) study design and setting; (iv) country of origin; (v) PCOS diagnostic criteria used; (vi) ultrasound machine and ultrasound transducer frequency range; (vii) participants' characteristics, including total sample size and sample size of cases and controls; (viii) participants' age; (ix) participants' BMI; (x) sonographic ovarian measures assessed; and (xi) diagnostic test accuracy measures, including proposed diagnostic thresholds, sensitivity, specificity and AUC values with their corresponding 95% confidence intervals, in the diagnosis of PCOS (per patient). Mean differences and SD of sonographic measures, age, and BMI were collected for both control women and women with PCOS. Where SEM were only reported, SD were calculated using a formula SD = SEM \times square root (n), where n is the number of participants (Higgins et al., 2019). When medians and percentile ranges were reported instead of means and SD, we used the median in place of mean and appropriate formulas were used to calculate SD from percentile ranges (Wan et al., 2014; Higgins et al., 2019). In the case of any missing or unclear data, two attempts were made to contact the corresponding author by email to request data or clarify methods. Data extraction was completed by five investigators (J.P., J.B., F.E.C., C.W., and K.G.) independently and was reviewed by all authors (A.L.O., L.M.J., and M.E.L.) for any potential extraction error.

Statistical analysis

Summary statistics for diagnostic accuracy, namely the proposed diagnostic threshold, sensitivity, and specificity values, were generated from included studies. If multiple studies included the same study population, the study with the greatest sample size was included for meta-analysis. A bivariate generalized linear mixed model was used to determine pooled sensitivity and specificity and their 95% confidence intervals. This approach models between-study heterogeneity in the sensitivity and specificity and the correlation between them directly using random effects (Reitsma et al., 2005). When bivariate models did not converge, the correlation between the sensitivity and specificity was set to zero or one of the random effects was removed from the model. The bivariate generalized linear mixed model also determined additional diagnostic measures such as diagnostic odds ratio (DOR) and likelihood ratio (LR). DOR is a single indicator of test performance, similar to accuracy, but is independent of disease prevalence. Similarly, LR is independent of disease prevalence and based on the ratio of sensitivity and specificity. The positive LR (LR+) determines the likelihood of an individual having the disease upon testing whereas a negative LR (LR-) determines the likelihood of an individual not having the disease upon testing.

To describe inter-study heterogeneity, we constructed forest plots and summary receiver-operating characteristic (SROC) curves with 95% prediction regions estimated using bivariate model meta-analysis. Given that meta-analysis of diagnostic test accuracy requires the knowledge of bivariate data in the form of sensitivity and specificity, statistical approaches for systematic reviews of interventions, such as Cochran's Q and I^2 statistic, were avoided. Subgroup analyses were performed to investigate potential sources of heterogeneity determined a priori and as appropriate based on the availability of data. Bivariate models were fitted with the following covariates to explore the influence of: (i) participants' mean age, (ii) participants' mean BMI, (iii) ultrasound transducer frequency, (iv) PCOS diagnostic criteria, (v) country of origin, (vi) ovarian measurement methodology, and (vii) risk of bias. Given that conventional funnel plot asymmetry uses DORs and even sample sizes of diseased and non-diseased groups to determine publication bias, they may be misleading in diagnostic test accuracy studies which have expectedly high DORs and often uneven sample sizes due to case-control study designs or prevalence of disease. Therefore, a modified funnel plot asymmetry method for diagnostic accuracy studies was constructed using the association between log DOR (lnDOR) and 'effective sample size' (ESS), which is a simple function of the number of diseased and non-diseased individuals (Deeks et al., 2005). All analyses were performed (J.P. and L.M.J) using Review Manager (RevMan) 5 (The Nordic Cochrane Center, Copenhagen, Norway), R (R Core Team, 2020), RStudio Version 1.3.959 (Rstudio Team, 2020), and the Hmisc (Harrell, 2021), the ggplot2 (Wickham, 2016), the mada (Doebler, 2020), the metafor (Viechtbauer, 2010), and the msm (Jackson, 2011) packages. Results were considered significant at $P \le 0.05$.

Results

Search results and characteristics of included studies

Overall, 2197 records were identified through the systematic database searches. In total, 1353 records were excluded during title and abstract screening and 130 records were excluded after full text review (Fig. 1). Finally, 31 studies (Fulghesu *et al.*, 2001; Jonard *et al.*, 2005; Allemand *et al.*, 2006; Chen *et al.*, 2008a,b; Alsamarai *et al.*, 2009; Dewailly *et al.*, 2011, 2014a; Diamanti-Kandarakis *et al.*, 2011; Köşüş *et al.*, 2011a,b; Lujan *et al.*, 2013; Bili *et al.*, 2014; Christ *et al.*, 2014; Köninger *et al.*, 2014; Çiraci *et al.*, 2015; Villarroel *et al.*, 2015; Carmina *et al.*, 2016; Kim *et al.*, 2017; Lie Fong *et al.*, 2017; Kar and Swoyam, 2018; Wongwananuruk *et al.*, 2018; Ahmad *et al.*, 2020; Le *et al.*, 2021; Giménez-Peralta *et al.*, 2022; Özay *et al.*, 2022; Vanden Brink *et al.*, 2023) that proposed diagnostic thresholds for sonographic ovarian markers to diagnose PCOS were deemed eligible for inclusion.

General characteristics of the included studies are presented in Table 1. The selected studies included 9144 participants, with 4464 control women and 4680 women with PCOS. Among the adult studies, 18 proposed diagnostic thresholds for FNPO, 21 studies, for OV, and seven studies, for FNPS. In addition, two studies proposed diagnostic thresholds for ovarian area (OA) (Jonard et al., 2005; Christ et al., 2014) and one for ovarian contour (Bili et al., 2014). Five studies proposed diagnostic thresholds using stromal features, including stromal area (SA) (Christ et al., 2014), stromal volume (Kar and Swoyam, 2018), stromal area over total ovarian area (S/A) (Fulghesu et al., 2001), stromal thickness (Özay et al., 2022), and stromal strain ratio (Çiraci et al., 2015). Several studies proposed multiple diagnostic thresholds, including phenotype-specific thresholds (Köninger et al., 2014), left and right ovary thresholds (Jarrett et al., 2019; Özay et al., 2022), three-dimensional (3D) thresholds (Allemand et al., 2006; Kar and Swoyam, 2018), and age-specific thresholds (Kim et al., 2017; Lie Fong et al., 2017; Ahmad et al., 2019). A range of diagnostic thresholds were proposed across each ultrasonographic marker. For FNPO, the included studies proposed a range of cutoffs from 8 to 28 follicles per ovary. For OV, the included studies proposed a range of cutoffs from 6 to 13 cm³. For FNPS, the included studies proposed a range of cutoffs from 7 to 13 follicles



Figure 1. Preferred Reporting Items for Systematic Review and Meta-Analyses (PRISMA) flow diagram of the systematic search and study selection process.

per cross-sectional image. The included studies primarily presented ovarian morphology measurements using the average value between the two ovaries (83% for FNPO, 71% for OV, 57% for FNPS) whereas the remainder presented the maximum measurement across both ovaries. Diagnosis of PCOS was mostly conducted using the NIH criteria (18/31 studies) followed by the Rotterdam (12/31 studies) and AE-PCOS criteria (1/31 studies). Four adolescent studies were identified, of which all proposed diagnostic thresholds for OV (Chen *et al.*, 2008b; Villa *et al.*, 2013; Villarroel *et al.*, 2015; Khashchenko *et al.*, 2020) as well as one, for FNPO (Villarroel *et al.*, 2015) and one, for ovarian to uterine index (OUI) (Khashchenko *et al.*, 2020).

Risk of bias and applicability assessments

The proportions of risk of bias and applicability assessments based upon the QUADAS-2 and QUADAS-C tools are presented in Fig. 2. Only one study (Dewailly *et al.*, 2011) met a low risk of bias for the Patient Selection domain. The remaining studies were graded as high risk of bias due to lack of randomized patient selection or consecutive sampling when evaluating individual index tests or comparing diagnostic test accuracy across multiple tests. All studies were also graded for high risk of bias in the

Index Test domain primarily due to the methodology for proposed thresholds. None of the proposed thresholds were prespecified and were instead determined using either Youden's index (which balances sensitivity and specificity) or using the 95th percentile of the control group. Both approaches have been used to define cutoffs for PCOM (Dewailly et al., 2014b) but generate a 'threshold effect' that introduces additional bias when comparing diagnostic accuracy. In addition, the 95th percentile cutoff is arbitrary and may not accurately reflect meaningful long-term health outcomes for PCOS patients. A low risk of bias was determined across index tests for most studies for the Reference Standard (FNPO: 58%; OV: 60%; FNPS: 71%; Stroma: 60%) and for Flow and Timing (FNPO: 79%; OV: 80%; FNPS: 71%; Stroma: 80%) domains. Given that the QUADAS-C tool incorporates QUADAS-2 scoring in its assessment of bias between index tests within a study, all studies were graded as high risk of bias in the Index Test domain. However, low risk of bias when comparing index tests within a study was determined for the majority of other three domains (Patient Selection: 16/17 (94%); Reference Standard: 12/17 (71%); Flow and Timing: 16/17 (94%)). For most index tests, concerns for applicability were primarily graded as low in the Patient Selection (FNPO: 79%; OV: 80%; FNPS: 100%)

roposed diag- ostic thresholds	NPO \geq 15 25 to <30 yo) 20 to <30 yo) NPO \geq 14 NDO \geq 14 NDO \geq 25 5 to <40 yo) V \geq 8.50 cm ³ 5 to <30 yo) V \geq 7.00 cm ³ 10 to <35 yo) V \geq 6.25 cm ³	55 to <40 yo) NPO ≥20.1 NPS ≥10.0 cm ³ NPS ≥10	W ≥7 cm³ NPS ≥12	N ≥9.64 cm³ C ≥8.75 cm	NPO ≥22 V ≥8.00 cm³	NPO ≥10 NPO (Max) ≥12 N ≥6.40 cm ³ V (Max) ≥7.90 cm ³	W ≥6.74 cm ³ W (Max) ≥7.82 cm ³	NPO ≥28 W ≥ 10.00 cm ³ A ≥5.00 cm ² A ≥3.00 cm ² NPS ≥9	(continued)
Reported P markers n evaluated	FNPO, OV (Max) ГТС: ГТС: ГТС: ГТС: ГТС: ГТС: ГТС: ГТС:	FINPO, OV, FNPS F	OV (Max), C FNPS (Max) F	OV, Ovarian C Contour (OC) C	FNPO, OV F	FNPO, FNPO F (Max), OV, F OV (Max), O	OV, OV (Max) C	FNPO, OV, OA, FSA, FNPS C C S S	
BMI (kg/m ²)	<u>Control:</u> N/A PCOS: N/A	$\frac{Control!}{24.00 \pm 5.50}$	24.20±10.80 24.004rol: 24.40±5.10 (Younger) 26.70±5.40 (Older) 30.60±8.70 (Younger) 31.30±8.50 31.50	(Utaer) <u>Control:</u> 22.50±3.70 <u>PCOS:</u>	24.90 ± 5.30 <u>Control</u> : 27.00 ± 4.00 <u>PCOS</u> : 37.00 ± 6.00	27.50±8.00 <u>Control:</u> N/A N/A N/A	$\frac{\text{Control}}{21.77 \pm 4.60}$	20.12±2.17 <u>Control:</u> 23.70±3.93 PCOS: 31.20±10.44	
Age (y)	<u>Control:</u> N/A N/A N/A	$\frac{\text{Control!}}{30.90 \pm 3.50}$	$\begin{array}{c} 5.1.20 \pm 5.5.00\\ \hline 5.1.20 \pm 5.5.00\\ \hline 28.10 \pm 6.40\\ \hline (Younger)\\ 48.10 \pm 6.60\\ \hline (Older)\\ \hline 27.80 \pm 5.70\\ \hline (Younger)\\ 63.0 \pm 4.50\\ \hline 60.3 \pm 4.50\\ \hline 60.3 \pm 5.70\\ \hline $	(Older) <u>Control:</u> <u>30.80±4</u> .30 <u>PCOS:</u> <u>20.005</u>	28.90 ± 5.00 <u>Control:</u> 23.10 ± 4.00 <u>PCOS:</u> 200.1	25.00±4.30 Control: 27.15±2.33 PCOS: 26.25±2.01	<u>Control</u> : 13.00 ± 1.23 <u>PCOS</u> :	12:5/ ± 1.25 Control: 27.00 ± 5.19 PCOS: 28.00 ± 5.19	
Transducer frequency (MHz)	4–8 (Shimadzu), 4–10 (Voluson)	4-8	Ŋ	5-7	8-10	Q	9	5–9 (Ultrasonix) 6–12 (Voluson)	
Ultrasound machine	Shimadzu SDU- 450XL, General Electric Voluson s8 E8C-RS	Philips ATL HDI 5000	Philips ATL HDI 1500	General Electric Voluson 730	Biosound Esaote MyLab 50 Xvision	Toshiba Sonolayer SSA-220A (Transvaginal or	Toshiba Sonolayer SSA-220A	(Iranisrectal) Ultrasonix RP, General Electric Voluson E8	
PCOS diagnosis	1990 NIH	1990 NIH	1990 NIH	Rotterdam	Rotterdam	1990 HIN	1990 NIH	1990 NIH	
Setting	<u>Control:</u> Community <u>PCCOS:</u> Academic Medical Center	Academic Medical Center	Academic Medical Center	Academic Medical Center	Academic Medical Center	Academic Medical Center	Academic Medical Center	<u>Control:</u> Community <u>PCOS:</u> Academic Medical Center	
Country	NSN	USA	USA	Greece	Italy	China	China	USA/Canada	
r Participants' N	Total: 1001 Control: 756 PCOS: 245	Total: 39 Control: 29 PCOS: 10	Total: 876 Control: 382 PCOS: 494	Total: 83 Control: 40 PCOS: 43	Total: 160 Control: 47 PCOS: 113	Total: 585 Control: 153 PCOS: 432	Total: 95 Control: 69 PCOS: 26	Total: 142 Control: 60 PCOS: 82	
First author, yea of publication	Ahmad et al., 2019	Allemand et al., 2006	Alsamarai et al., 2009	Bili et al., 2014	Carmina et al., 2016	Chen et al., 2008a	Chen et al., 2008b [adolescent]	Christ et al., 2014	

Table 1. Contin	ned									
First author, yea of publication	r Participants' N	Country	Setting	PCOS diagnosis	Ultrasound machine	Transducer frequency (MHz)	Age (y)	BMI (kg/m²)	Reported markers evaluated	Proposed diag- nostic thresholds
Çiraci et al., 201	5 Total: 96 Control: 48 PCOS: 48	Turkey	Academic Medical Center	Rotterdam	General Electric Logiq E9	6.5	<u>Control:</u> 27.10±5.20 <u>PCOS:</u> 25.70+4.20	<u>Control:</u> N/A PCOS: N/A	FNPO, OV, Stromal Strain Ratio (SSR)	$FNPO \ge 12$ $OV \ge 10.00 \text{ cm}^3$ $SSR \ge 3.80$
Dewailly et al., 2011	Total: 128 Control: 66 PCOS: 62	France	Academic Medical Center	1990 NIH	General Electric Voluson E8 Expert	5-9	<u>Control:</u> 30.00±3.86 <u>PCOS:</u> 27.60±4.72	Control: 24.00±5.74 PCOS: 28.00+6.99	FNPO, OV	$FNPO \ge 19$ $OV \ge 7.00 \text{ cm}^3$
Dewailly et al., 2014a	Total: 716 Control: 621 PCOS: 95	Croatia	Academic Medical Center	1990 NIH	Toshiba Nemio	5-7	<u>Control:</u> <u>32.50±3.86</u> <u>PCOS:</u> <u>78.0±4.79</u>	<u>Control:</u> 23.00±3.34 <u>PCOS:</u> 27.00±6.08	FNPO	FNPO ≥12
Diamanti- Kandarakis et al., 2011	Total: 97 Control: 47 PCOS: 50	Greece	Academic Medical Center	1990 NIH	N/A	N/A	<u>Control:</u> 27.15±6.72 PCOS: 26.46±5.86	<u>Control:</u> 26.27 ± 5.30 <u>PCOS:</u> 26.49 ± 5.00	FNPO	FNPO ≥19.5
Ertekin <i>et</i> al., 2019	Total: 53 Control: 16 PCOS: 37	Turkey	Academic Medical Center	Rotterdam	Samsung RS80	Q	<u>Control</u> : 23.0±5.0 <u>PCOS</u> : 21 5+3 7	Control: 25.5±3.8 PCOS: 24.5+4.8	NO	OV ≥7.5
Fulghesu et al., 2001	Total: 83 Control: 30 PCOS: 53	Italy	Academic Medical Center	Rotterdam (Frank)	General Electric Logiq 500	6.5	Control: N/A PCOS: N/A	Control: 23.15±4.49 PCOS: 23.61±3.88	S/A	$S/A \ge 0.34$
Giménez-Peralti et al., 2022	a Total: 311 Control: 111 PCOS: 200	Spain	Academic Medical Center	Rotterdam	Aplio 500	٦	<u>Control:</u> 31.60±0.59 <u>PCOS:</u> N/A	Control: 22.90±0.55 PCOS: N/A	FNPO	FNPO ≥12
Jarrett et al., 2019	Total: 154 Control: 67 PCOS: 87	USA/Canada	<u>Control:</u> Community <u>PCOS:</u> Academic Medical Center	1990 NIH	Ultrasonix RP, General Electric Voluson E8	5–9 (Ultrasonix), 6–12 (Voluson)	<u>Control:</u> 27.00±5.93 <u>PCOS:</u> 27.00±5.19	<u>Control:</u> 23.60±4.22 <u>PCOS:</u> 32.00±10.74	ΛΟ	OV ≥10.00 cm ³ (Right) OV ≥9.00 cm ³ (Left)
Jonard et al., 2005	Total: 155 Control: 57 PCOS: 98	France	Academic Medical Center	1990 NIH	General Electric Logiq 400	7	<u>Control:</u> 29.00±4.10 <u>PCOS:</u> 27.20±5.27	<u>Control:</u> 22.90±4.88 <u>PCOS:</u> 27.90+8.07	FNPO, OV, OA	FNPO ≥ 12 OV $\ge 7.00 \text{ cm}^3$ OA $\ge 5.00 \text{ cm}^2$
Kar and Swoyam, 2018	Total: 131 Control: 45 PCOS: 86	India	Tertiary Care Hospital	Rotterdam	General Electric Voluson E8	6-12	Control: 28.45 ± 4.62 PCOS: 26.03 ± 3.52	Control: 23.02 ± 3.58 PCOS: 25 71 ± 4 87	FNPO, OV, SV	FNPO \ge 12 OV \ge 6.15 cm ³ SV \ge 6 cm ³
Khashchenko et al., 2020 [adolescent]	Total: 160 Control: 30 PCOS: 130	Russia	Academic Medical Center	Rotterdam	General Electric Vivid-q	1.8–6.0	<u>Control</u> : 16.0±1.48 <u>PCOS</u> : 16.0±1.48	<u>Control:</u> 20.2±2.52 <u>PCOS</u> : 22.4±5.41	ov, oui	OV ≥10.7 cm³ OUI ≥3.95

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(continued)

	Proposed diag- nostic thresholds	OV ≥12 cm ³ (18-24 yo) OV ≥10 cm ³ (25-29 yo) OV ≥9 cm ³ (30-24 yo) OV ≥8 cm ³ (30-24 yo) OV ≥8 cm ³ (40 44 yo) FNPS ≥13 (18-24 yo) FNPS ≥13 (18-24 yo) FNPS ≥14 (18-24 yo) FNPS ≥10 (18-24 yo) FNPS ≥10	FNPE 100 FNPO 29.5 (Severe PCOS) FNPO 28.5 (Mild PCOS) OV 210.50 cm ³ OV 210.20 cm ³ OV 210.20 cm ³	$OV \ge 6.43 \text{ cm}^3$	FNPO ≥8 OV ≥6.43 cm ³	OV ≥6.03 cm³	FNPO \geq 12.25 (Young) FNPO \geq 10.75 (Old)	(continued)
	Reported markers evaluated	OV (Max), FNPS (Max)	FNPO (Max), OV (Max)	OV	FNPO, OV	NO	FNPO	
	BMI (kg/m²)	$\begin{array}{c} \hline Control:\\ \hline 23.8\pm4.4\\ \hline 23.8\pm4.4\\ (18-24\ yc)\\ 24.3\pm4.8\\ (25-29\ yc)\\ 23.8\pm4.7\\ (30-34\ yc)\\ 26.3\pm5.8\\ (35-39\ yc)\\ 26.3\pm5.8\\ (35-39\ yc)\\ 20.4\pm9.5\\ (25-29\ yc)\\ 30.4\pm9.5\\ (25-29\ yc)\\ 30.4\pm9.5\\ (35-39\ yc)\\ 33.5\pm7.5\\ (35-39\ yc)\\ 33.5\pm7.5\\ (35-39\ yc)\\ \end{array}$	<u>Control:</u> 24.30±4.40 <u>PCOS (Severe):</u> 29.10±7.40 <u>PCOS (Mild):</u> 26.70±7.00	<u>Control:</u> 20.80±2.40 <u>PCOS:</u> 26.50±5.30	$\frac{\text{Control!}}{20.80 \pm 2.40}$ $\frac{\text{PCOS!}}{27.10 \pm 6.20}$	<u>Control:</u> 20.82±2.56 <u>PCOS:</u> 21 31±2 80	<u>Control:</u> N/A PCOS: N/A	
	Age (y)	$\begin{array}{c} \hline Control:\\ \hline 22.1\pm 1.8\\ \hline 22.1\pm 1.8\\ \hline (18-24yo)\\ \hline 27.2\pm 1.3\\ \hline 27.2\pm 1.3\\ \hline 27.2\pm 1.3\\ \hline 25-29yo)\\ \hline 37.3\pm 1.4\\ \hline (35-39yo)\\ \hline 9COS:\\ \hline 27.3\pm 1.4\\ \hline (35-39yo)\\ \hline 27.3\pm 1.4\\ \hline (35-39yo)\\ \hline 37.8\pm 1.5\\ \hline (35-39yo)\\ \hline (35-39yb)\\ \hline (35-39yb)$	$\frac{Control:}{34.00 \pm 5.50}$ $\frac{PCOS (Severe):}{27.10 \pm 5.80}$ $\frac{PCOS (Mild):}{29.30 \pm 5.80}$	<u>Control:</u> 26.70±5.60 <u>PCOS:</u> 26.30±5.40	<u>Control:</u> 26.70±5.60 <u>PCOS:</u> 24.90±6.10	<u>Control:</u> 33.99±4.78 <u>PCOS:</u> 37.66±4.10	<u>Control:</u> N/A N/A N/A	
	Transducer frequency (MHz)	8 4	6 - 6	6.5	6.5	σ	N/A	
	Ultrasound machine	ATL HDI 1500 Ultrasound, Phillips HD11 XE	General Electric Voluson E8 Expert	General Electric Logic 200 Pro	General Electric Logic 200 Pro	ALOKA ProSound SSD-3500	N/A	
	PCOS diagnosis	HIN 0691	Rotterdam	Rotterdam	AE-PCOS	Rotterdam	1990 NIH	
	Setting	Academic Medical Center	Academic Medical Center	Academic Medical Center	Academic Medical Center	Academic Medical Center	Academic Medical Center	
	Country	USA	Germany	Turkey	Turkey	Vietnam	Nether- lands/ USA	
ned	r Participants' N	Total: 1210 Control: 666 PCOS: 544	Total: 128 Control: 48 PCOS: 80	Total: 310 Control: 100 PCOS: 210	Total: 316 Control: 65 PCOS: 251	Total: 392 Control: 273 PCOS: 119	Total: 945 Control: 297 PCOS: 648	
Table 1. Contin	First author, yea of publication	Kim et al., 2017	Köninger et al., 2014	Köşüş et al. 2011a	Köşüş et al. 2011b	Le <i>e</i> t al., 2021	Lie Fong et al., 2017	

Table 1. Contin	ued									
First author, year of publication	· Participants' N	Country	Setting	PCOS diagnosis	Ultrasound machine	Transducer frequency (MHz)	Age (y)	BMI (kg/m²)	Reported markers evaluated	Proposed diag- nostic thresholds
Lujan et al., 2013	Total: 168 Control: 70 PCOS: 98	USA/Canada	<u>Control:</u> Community <u>PCOS:</u> Academic Medical Center	1990 NIH	Ultrasonix RP, General Electric Voluson E8	5-9 (Ultrasonix), 6-12 (Voluson)	<u>Control:</u> 27.00±8.89 <u>PCOS:</u> 28.00±5.19	<u>Control:</u> 23.90±4.07 <u>PCOS:</u> 30.10±10.07	FNPO, OV, FNPS	FNPO ≥26 OV ≥10.00 cm³ FNPS ≥9
Özay et al., 2022	Total: 152 Control: 46 PCOS: 106	Cyprus	Academic Medical Center	Rotterdam	General Electric Voluson 730 Expert	6-7	<u>Control:</u> 22.00±3.25 <u>PCOS:</u> 21.00±3.00	<u>Control</u> : 22.00 ± 3.25 <u>PCOS</u> : 21.00 ± 3.00	ST (Max)	N/A
Vanden Brink et al., 2023	Total: 117 Control: 51 PCOS: 66	USA	Academic Medical Center, Community	1990 NIH	General Electric Voluson	N/A	$\frac{Control:}{28.00 \pm 5.40}$ $\frac{PCOS}{26.00 + 5.30}$	$\frac{\text{Control:}}{27.10 \pm 6.70}$ $\frac{\text{PCOS:}}{31.20 \pm 9.30}$	FNPO, OV, FNPS	FNPO ≥26 OV ≥8.2 cm ³ FNPS ≥8
Villa <i>et a</i> l., 2013 [adolescent]	Total: 134 Control: 48 PCOS: 86	Italy	Academic Medical Center	1990 NIH	Biosound Esaote MyLab 25 Gold	3.5–5	<u>Control:</u> 15.3±1.7 <u>PCOS:</u> 15.7±1.4	<u>Control:</u> 23.9±4.9 <u>PCOS:</u> 25.7±5.4	OV	OV ≥5.596 cm³
Villarroel et al., 2015 [adolescent]	Total: 89 Control: 63 PCOS: 26	Chile	Academic Medical Center	1990 NIH	Medison SonoAce 6000C	ы	<u>Control:</u> 16.6±1.5 <u>PCOS:</u> 17.3±1.9	N/A	FNPO, OV	$FNPO \ge 12$ $OV \ge 10 \text{ cm}^3$
Wongwananur- uk et al., 2018	Total: 118 Control: 63 PCOS: 55	Thailand	Academic Medical Center	1990 NIH	Aloga Alpha 6 (Transvaginal or Transrectal)	ω	<u>Control:</u> 29.70±7.20 <u>PCOS:</u> 25.10±5.30	<u>Control:</u> 23.50±5.10 <u>PCOS:</u> 25.30±6.30	FNPO (Max), OV (Max), FNPS (Max)	FNPO ≥15 OV ≥6.50 cm ³ FNPS ≥7

PCOS: polycystic ovary syndrome; NIH: National Institutes of Health; AE-PCOS: Androgen Excess & PCOS Society; FNPS: follicle number per cross-section; SA: stromal area; S/A: stromal area; ST: stromal thickness; SV: stromal volume; OA: ovarian to uterine index; OV: ovarian volume; FNPO: follicle number per ovary.

and Reference Standard (FNPO: 100%; OV: 92%; FNPS: 100%; Stroma: 100%) domains. The only exception was Stroma in which majority had high concerns regarding applicability for Patient Selection (40%). For the Index Test domain, most studies were also given low concerns regarding applicability for FNPO (63%), OV (80%), and Stroma (100%). However, there were high concerns regarding applicability for FNPS (29%). Full details of QUADAS-2 and QUADAS-C scores for each study and index test are presented in Supplementary Table S3 for adults and Supplementary Table S4 for adolescents.

Diagnostic meta-analysis

Five studies (Alsamarai et al., 2009; Köşüş et al., 2011a; Christ et al., 2014; Jarrett et al., 2019; Vanden Brink et al., 2023) used the same study population when evaluating diagnostic accuracy of ultrasonographic ovarian markers and were omitted from the meta-analysis. One study included in the meta-analysis used the same control group when proposing diagnostic thresholds for two PCOS phenotypes (Severe, Mild) based upon the Rotterdam criteria (Köninger et al., 2014). Given the limited number of studies and the variation in features measured, meta-analysis was not conducted on certain ovarian (OA, ovarian contour) and all stromal features. This process excluded two studies (Fulghesu et al., 2001; Özay et al., 2022) that evaluated stromal features exclusively from the meta-analysis. In the end, 8338 unique study participants (4156 control participants and 4182 women with PCOS), including 7442 adult women (3883 control and 3859 PCOS) and 478 adolescent girls (210 control and 268 PCOS), were included as part of the diagnostic meta-analysis.

Diagnostic accuracy of ultrasonographic markers

The sensitivity and specificity forest plots for the ultrasonographic ovarian markers are presented in Fig. 3 and a summary of the pooled diagnostic measures is presented in Table 2. Pooled sensitivity was similar across all ultrasonographic markers whereas pooled specificity was greater for FNPO compared to OV. The improved pooled specificity for FNPO contributed to its higher diagnostic accuracy compared to OV as defined by its AUC value when visualizing all markers on SROC curves (Fig. 4). Although FNPO also had elevated specificity compared to FNPS, the two markers overlapped in their 95% confidence region, contributing to an intermediate AUC value for FNPS (0.870) that was lower than FNPO (0.905) but higher than OV (0.856). Similarly, FNPO had a higher DOR compared to OV and FNPS but exhibited overlap in their 95% confidence regions. FNPO had an elevated LR+ compared to OV and FNPS whereas the LR- was similar across all markers. As judged by the forest plots and SROC curves, FNPO had less within-study and between-study variability in its diagnostic accuracy, respectively, compared to OV and FNPS (Figs 3 and 4). Diagnostic meta-analysis was only possible for OV in adolescent studies due to the limited number of studies available. However, pooled diagnostic measures for OV in adolescents suggest that they may offer similar accuracy as OV in adults (Table 2). Statistical tests evaluating the association between lnDOR and ESS showed no evidence of funnel plot asymmetry for FNPO (P = 0.37), FNPS (P = 0.10), and OV in adolescents (P = 0.71). In contrast, there was significant funnel plot asymmetry for OV in adults (P = 0.01) (Supplementary Fig. S1). Given that heterogeneity in test accuracy is expected in diagnostic test accuracy reviews, it is unclear whether the observed funnel plot asymmetry for OV is due to publication bias alone (Macaskill et al., 2010).

Subgroup analysis

Stratified meta-analyses using pre-determined subgroups were conducted to explore potential sources of heterogeneity across studies and are presented in Table 3. For FNPO, studies were stratified based on whether their proposed thresholds were above or below previously recommended diagnostic thresholds, such as the \geq 12 follicles threshold (The Rotterdam ESHRE/ASRM-Sponsored PCOS Consensus Workshop Group, 2004) and the \geq 20 follicles threshold (Teede *et al.*, 2018a). The proposed threshold of \geq 25 follicles previously recommended by the AE-PCOS society (Dewailly *et al.*, 2014b) was not evaluated since only one study (Lujan *et al.*, 2013) met that cutoff. There was no significant threshold effect for FNPO. Similarly, stratification based upon the previously proposed \geq 10 cm³ threshold did not improve diagnostic measures for OV.

Age-specific stratifications separating adult studies with mean PCOS age of \geq 30 years old and those with mean age <30 years old did not improve diagnostic measures for both FNPO and OV. Similar results were observed when stratifying age for the control population (data not shown). There was an improvement in sensitivity when stratifying for study populations \geq 30 years old for FNPS. However, there was considerable overlap in the 95% confidence region and a limited number of studies between age groups for FNPS (Table 3; Supplementary Fig. S2). From studies that reported the mean age of their PCOS population, the weighted mean age for FNPO, OV, and FNPS were 26.28 ± 1.63, 26.91 ± 3.42, and 27.90 ± 4.69 years old, respectively. Similar weighted means were observed for the age of the control population across markers.

BMI-specific stratifications separating studies with mean PCOS BMI of \geq 30 kg/m² ('obese') and <30 kg/m² ('non-obese') did not improve diagnostic measures in both FNPO, OV, or FNPS. Similar findings were also observed when stratifying for BMI in the control population (data not shown).

Geographic stratifications separated adult studies into three general regions: North America, Europe and Asia. Studies from North America had lower diagnostic accuracy compared to studies from Europe and Asia for both FNPO and OV. Specifically, Asian studies had improved sensitivity for FNPO and European studies had improved specificity, DOR and LR+ for OV compared to North American studies (Table 3; Supplementary Fig. S2). Comparison of the PCOS populations across geographic regions showed that the weighted mean for FNPO was highest in North American studies (27.10±7.28 follicles), intermediate in European studies (22.69 ± 7.49 follicles), and lowest in Asian studies (13.22 ± 4.13 follicles) (Supplementary Fig. S3). In contrast, the weighted mean for OV was similar across all geographic regions (North America: $10.82 \pm 1.38 \text{ cm}^3$; Europe: $11.19 \pm 2.36 \text{ cm}^3$; Asia: $10.39 \pm 2.01 \text{ cm}^3$ (Supplementary Fig. S3). For the control populations, North American studies also had a slightly higher weighted mean FNPO $(10.24 \pm 1.89 \text{ follicles})$ and OV $(6.48 \pm 0.61 \text{ cm}^3)$ compared to European (FNPO: 7.78 ± 1.98 follicles; OV: 5.71 ± 1.10 cm³) and Asian (FNPO: 6.94 ± 1.69 follicles; OV: 5.58 ± 0.91 cm³) studies (Supplementary Fig. S3).

Although age and BMI did not directly account for heterogeneity observed across adult studies, they may also underlie the observed geographic differences in diagnostic accuracy. The weighted mean age in the PCOS population was younger in Asian $(25.74\pm0.61$ years old) studies compared to North American studies $(28.30\pm0.93$ years old) and European $(26.80\pm2.32$ years old) studies for FNPO (Supplementary Fig. S4). In addition, weighted mean age for the control population in European studies was older $(31.53\pm2.38$ years old) compared to North American (28.14



Figure 2. Graphical display of QUADAS-2 and QUADAS-C judgments for risk of bias as percentages across included studies. FNPO: follicle number per ovary; OV: ovarian volume; FNPS: follicle number per cross-section.

 ± 1.78 years old) and Asian (27.65 ± 1.04 years old) studies for FNPO (Supplementary Fig. S4). For FNPO and OV, the weighted mean BMI categorized the PCOS populations for North America studies as obese (FNPO: 30.29 ± 0.61 kg/m²; OV: 30.76 ± 1.33 kg/m²) whereas PCOS populations for studies from Europe (FNPO: 27.62 ± 0.73 kg/m²; OV: 27.62 ± 1.10 kg/m²) and Asia (FNPO: 26.54 \pm 0.75 kg/m²; OV: 25.27 ± 2.24 kg/m²) were categorized as overweight (Supplementary Fig. S5). For the control population, the weighted mean BMI for North American studies (FNPO: 23.93 $\pm 0.05 \text{ kg/m}^2$; OV: $24.17 \pm 0.71 \text{ kg/m}^2$) was also higher than Asian studies (FNPO: $22.36 \pm 1.23 \text{ kg/m}^2$; OV: $21.56 \pm 1.29 \text{ kg/m}^2$) (Supplementary Fig. S5).

Stratifications based on PCOS diagnostic criteria separated adult studies into either those diagnosed using the 1990 NIH

A	Study Ahmad 2019a Ahmad 2019b Ahmad 2019c Allemand 2006 Carmina 2016 Chen 2008a Ciraci 2015 Dewailly 2011 Dewailly 2011 Diamanti-Kandarakis 20 Gimenez-Peralta 2022 Jonard 2005 Kar 2018 Koninger 2014a Koninger 2014b Kosus 2011 Lie Fong 2017b Lujan 2013 Villarroel 2015 Wongwananuruk 2018	1 3 111 2 3 1	TP FF 91 68 72 52 7 2 52 72 52 7 0 5 7 68 17 05 7 68 17 5 51 570 47 43 1 5 5 77 2 80 2 5 5 19 5 519 5 5 19 5 3 8 6 888 4 88 6 8 8 6 445 2 16 5 5 1 5	P FN 3 34 1 2 16 1 3 8 2 3 8 7 64 1 3 7 64 1 6 7 7 7 16 2 2 2 13 8 4 2 2 1 6 5 7 9 2 13 65 1 5 4 9 10	TN 160 196 232 40 136 43 61 574 60 55 43 95 108 91 66 47 54	Sensitivity (95% C1) 0.73 [0.64, 0.80] 0.82 [0.72, 0.89] 0.75 [0.57, 0.89] 0.70 [0.35, 0.93] 0.93 [0.87, 0.97] 0.85 [0.81, 0.88] 0.85 [0.72, 0.94] 0.81 [0.69, 0.90] 0.84 [0.74, 0.90] 0.84 [0.74, 0.90] 0.84 [0.74, 0.93] 0.79 [0.73, 0.84] 0.79 [0.69, 0.86] 0.93 [0.85, 0.97] 0.88 [0.77, 0.95] 0.90 [0.70, 0.99] 0.95 [0.91, 0.97] 0.84 [0.80, 0.88] 0.79 [0.74, 0.84] 0.85 [0.76, 0.91] 0.85 [0.65, 0.96] 0.82 [0.69, 0.91]	Specificity (95% CI) 0.70 [0.64, 0.76] 0.79 [0.73, 0.84 0.83 [0.78, 0.87] 1.00 [0.88, 1.00] 0.85 [0.72, 0.94] 0.89 [0.83, 0.93] 0.90 [0.77, 0.97] 0.92 [0.83, 0.93] 0.90 [0.77, 0.97] 0.92 [0.88, 1.00] 0.54 [0.44, 0.64] 0.96 [0.88, 1.00] 0.96 [0.85, 0.99] 0.90 [0.77, 0.97] 0.81 [0.67, 0.91] 1.00 [0.94, 1.00] 0.96 [0.87, 0.98] 0.94 [0.86, 0.98] 0.75 [0.62, 0.85] 0.86 [0.75, 0.93]	Sensitivity (95% Cl) S	pecificity (95% CI)
В	Study Ahmad 2019a Ahmad 2019b Ahmad 2019c Allemand 2006 Bili 2014 Carmina 2016 Chen 2008a Ciraci 2015 Dewailly 2011 Ertekin 2019 Jonard 2005 Kar 2018 Kim 2017a Kim 2017a Kim 2017c Kim 20	TP 91 80 29 5 39 77 350 48 54 300 66 71 108 138 061 19 63 319 238 73 79 9 45	FP 64 71 90 0 1 4 22 14 7 1 5 1 7 1 82 33 3 11 12 12 135 11 12	FN TI 620 16 621 17 11 19 5 2: 4 3: 36 4 82 13 0 3: 7 17 132 5: 24 9 132 5: 15 4: 9 1 6 3 13 5: 46 13: 19 5: 10 5	N 5551993149524272397763891	ensitivity (95% Cl) 0.60 [0.52, 0.68] 0.75 [0.65, 0.83] 0.72 [0.56, 0.85] 0.50 [0.19, 0.81] 0.91 [0.78, 0.97] 0.68 [0.59, 0.77] 0.81 [0.77, 0.85] 1.00 [0.93, 1.00] 0.87 [0.76, 0.94] 0.81 [0.65, 0.92] 0.67 [0.57, 0.76] 0.83 [0.73, 0.90] 0.66 [0.58, 0.73] 0.85 [0.79, 0.90] 0.90 [0.83, 0.95] 0.87 [0.77, 0.94] 0.68 [0.48, 0.84] 0.86 [0.42, 1.00] 0.90 [0.70, 0.99] 0.95 [0.91, 0.97] 0.61 [0.52, 0.70] 0.81 [0.71, 0.88] 0.82 [0.69, 0.91]	Specificity (95% Cl) 0.72 [0.66, 0.78] 0.71 [0.65, 0.77] 0.68 [0.62, 0.73] 1.00 [0.88, 1.00] 0.97 [0.87, 1.00] 0.91 [0.80, 0.98] 0.86 [0.79, 0.91] 0.71 [0.56, 0.83] 0.89 [0.79, 0.96] 0.94 [0.70, 1.00] 0.91 [0.81, 0.97] 0.98 [0.88, 1.00] 0.75 [0.69, 0.80] 0.54 [0.47, 0.62] 0.65 [0.52, 0.76] 0.86 [0.65, 0.97] 0.70 [0.35, 0.93] 0.77 [0.63, 0.88] 0.75 [0.60, 0.86] 0.82 [0.70, 0.90] 0.51 [0.44, 0.57] 0.84 [0.74, 0.92] 0.81 [0.69, 0.90]	Sensitivity (95% Cl) S	pecificity (95% CI)
С	Study Allemand 2006 Kim 2017a Kim 2017b Kim 2017c Kim 2017c Kim 2017d Kim 2017e Kim 2017f Lujan 2013 Wongwananuruk 2018	TP 9 111 92 107 62 21 7 68 48	FP 1 0 56 1 14 3 1 5 5 4 7 3 10	N TN 1 29 52 226 70 165 7 65 8 51 7 17 0 63 7 53 7 53	N S 5 5 1 7 5 3 3 3	ensitivity (95% CI) 0.90 [0.55, 1.00] 0.68 [0.60, 0.75] 0.57 [0.49, 0.65] 0.94 [0.88, 0.97] 0.89 [0.79, 0.95] 0.75 [0.55, 0.89] 1.00 [0.59, 1.00] 0.69 [0.59, 0.78] 0.87 [0.76, 0.95]	Specificity (95% Cl) 1.00 [0.88, 1.00] 0.80 [0.75, 0.85] 0.92 [0.87, 0.96] 0.68 [0.57, 0.77] 0.77 [0.65, 0.87] 0.77 [0.55, 0.92] 0.60 [0.26, 0.88] 0.90 [0.80, 0.96] 0.84 [0.73, 0.92]	Sensitivity (95% Cl) S	pecificity (95% Cl)
D	Study Chen 2008b Khashchenko 2020 Villa 2013 Villarroel 2015	TP F 52 108 77 1 20 1	P FN 2 17 5 22 0 9 0 6	TN 9 24 25 38 53	Sen: (((sitivity (95% Cl) Sp 0.75 [0.64, 0.85] 0.83 [0.76, 0.89] 0.90 [0.81, 0.95] 0.77 [0.56, 0.91]	Decificity (95% Cl) 0.92 [0.75, 0.99] 0.83 [0.65, 0.94] 0.79 [0.65, 0.90] 0.84 [0.73, 0.92]	Sensitivity (95% Cl) Sp	vecificity (95% Cl)

Figure 3. Sensitivity and specificity forest plots for ultrasonographic ovarian markers in the diagnosis of polycystic ovary syndrome (PCOS). (A) Follicle number per ovary (FNPO), (B) ovarian volume (OV), (C) follicle number per cross-section (FNPS), and (D) OV (adolescents). TP: true positives; FP: false positives; FN: false negatives; TN: true negatives; CI: confidence interval.

criteria or those diagnosed using the Rotterdam criteria. One study diagnosed PCOS using the AE-PCOS criteria (Köşüş *et al.*, 2011b) and was added to the Rotterdam group. Sensitivity was improved for the Rotterdam group versus the 1990 NIH group in FNPO (Table 3; Supplementary Fig. S2) whereas there was no significant difference in diagnostic accuracy measures between

groups for OV. Stratification of PCOS diagnostic criteria was partially aligned by geographic regions. North American studies diagnosed the condition using only the 1990 NIH criteria (100% (5/5)) whereas it was infrequently used in Asian studies (29% (2/ 7)) in preference for the Rotterdam criteria. Notably, the increased pooled sensitivity observed in the Rotterdam group

Table 2. Summary diagnostic accuracy measures of ultrasonographic markers to detect PCOS.

Index Test	N	Sensitivity % (95% CI)	Specificity % (95% CI)	AUC	DOR (95% CI)	Positive LR (95% CI)	Negative LR (95% CI)
FNPO	16	84.32 (81.27–86.95)	91.06 (86.44–94.21)*	0.905	54.76 (29.69–101.02)	9.43 (7.40–12.03)*	0.17 (0.11–0.26
OV (adult)	16	81.48 (76.05–85.90)	81.04 (74.66–86.11)*	0.856	18.80 (11.62–30.41)	4.30 (3.28–5.63)*	0.23 (0.17-0.31
OV (adolescent) FNPS	4 4	81.84 (75.74–86.68) 81.07 (70.10–88.67)	83.54 (77.06–88.46) 82.70 (75.15–88.31)	0.892 0.870	22.87 (13.16–39.74) 20.47 (12.69–33.02)	4.97 (3.62–6.82)* 4.69 (2.99–7.35)*	0.22 (0.15–0.31) 0.23 (0.17–0.31)

FNPO: follicle number per ovary; OV: ovarian volume; FNPS: follicle number per cross-section; DOR: diagnostic odds ratio; LR: likelihood ratio. * Significant difference between markers (bolded).



Figure 4. Summary receiver-operating characteristic (SROC) curve for ultrasonographic ovarian markers in the diagnosis of polycystic ovary syndrome (PCOS) in adult women. (A) Follicle number per ovary (FNPO), (B) ovarian volume (OV), (C) follicle number per cross-section (FNPS), and (D) all ovarian markers. Each symbol represents a single study. The black dot represents the summary point and the dotted region represents the 95% confidence region. The diagonal dotted line represents AUC = 0.50 (random chance).

versus 1990 NIH group was similar to results comparing Asian versus North American studies. European studies applied both PCOS diagnostic criteria equally (44% (4/9)).

Ultrasound transducer frequency was stratified based on adult studies that used either \geq 8 MHz or <8 MHz, as \geq 8 MHz is the recommended transducer frequency to maximal resolution

	Index test	z	Sensitivity $\%$ (95 $\%$ Cl)	Specificity % (95% CI)	DOR (95% CI)	Positive LR (95% CI)	Negative LR (95% CI)
Follicle number per ovary (FNPO) Cutoff value	≥20 follicles <20 follicles	13	87.64 (78.78–93.12) 83.54 (80.29–86.35)	93.74 (82.40–97.96) 90.71 (85.08–94.35)	106.18 (28.06–401.70) 49.54 (24.48–100.24)	14.00 (7.51–26.11) 8.99 (6.88–11.74)	0.13 (0.05–0.37) 0.18 (0.11–0.29)
Age groups	≥12 follicles <12 follicles ≥30 years old	12 4 4	82.98 (79.85–85.71) 87.18 (80.01–92.03) 79.29 (74.84–83.13)	90.20 (84.67–93.87) 93.04 (83.34–97.28) 89.93 (76.86–96.00)	44.85 (23.72–84.81) 90.89 (23.57–350.50) 34.18 (12.32–94.85)	8.46 (6.65–10.77) 12.53 (7.07–22.20) 7.87 (5.80–10.69)	0.19 (0.12–0.29) 0.14 (0.06–0.33) 0.23 (0.11–0.50)
BMI groups	<30 years old ≥30 kg/m²	14	85.80 (82.38–88.65) 83.33 (75.09–89.24)	92.08 (88.03–94.84) 95.96 (89.73–98.48)	70.29 (37.54–131.64) 118.75 (38.70–364.36)	10.84 (8.23 - 14.26) 20.63 (12.34 - 34.46)	0.15 (0.10-0.23) 0.17 (0.08-0.40)
Geography	<30 kg/m ⁻ North America Europe	യ ന യ	8/./8 (83.2/-91.21) 78.63 (72.91-83.41) * 83.14 (79.46-86.27)	92.92 (88.48–95./3) 87.24 (73.06–94.52) 90.96 (84.73–94.80)	94.32 (46./5–190.30) 25.17 (9.48–66.83) 49.61 (25.23–97.55)	12.40 (8.66–17.7) 6.16 (4.40–8.63) 9.19 (7.12–11.88)	0.13 (0.08–0.21) 0.24 (0.12–0.51) 0.19 (0.11–0.31)
Diagnostic criteria	Asia 1990 NIH	10 10 1	89.33 (83.70–93.18)* 81.76 (79.23–84.05)*	93.05 (85.44–96.83) 91.06 (86.40–94.24)	112.13 (42.96–292.67) 45.69 (26.17–79.76)	12.86 (8.08–20.44) 9.15 (7.51–11.16)	0.11 (0.05-0.24) 0.20 (0.14-0.30)
Transducer frequency	Solution Section Sect	9 O I	89.81 (84.11-93.62)* 84.27 (80.07-87.72) 86.04 (80.48.40)	89.79 (77.46-95.75) 86.42 (79.62-91.20) 04.12 (77.07 07.45)	77.55 (26.62–225.86) 34.09 (16.95–68.55) 106 82 721 68 260 20)	8.80 (5.51–14.05) 6.21 (4.59–8.38) 14 02 (0 75 25 00)	0.11 (0.05-0.26) 0.18 (0.12-0.28) 0.11 (0.05 0.30)
Methodology	<5 MHZ 2D real time Offine	0 14 c	80.94 (80.48-91.49) 84.30 (80.97-87.13) 82 23 (75 00 80 24)	94.13 (87.07-97.45) 90.24 (85.19-93.70) 05 05 (80 72 08 48)	106.83 (31.08-300.20) 49.63 (26.30-93.67) 118 75 (38 70, 364 36)	14.62 (8./)-22.05) 8.64 (6.67-11.19)* 20.62 (13.24.24.46)*	0.17 (0.00-0.30) 0.17 (0.12 0.26) 0.17 (0.08 0.10)
Risk of bias	High risk Low risk	7 6 L	86.52 (82.03–90.03) 86.52 (82.03–90.03) 81.75 (77.80–85.14)	91.71 (85.33–95.47) 89.74 (82.09–94.34)	(90:300-00:00) 01:04 71.04 (30.07-167.83) 39.18 (18.20-84:36)	7.97 (6.00–10.58)	0.15 (0.08-0.40) 0.15 (0.08-0.26) 0.20 (0.12-0.35)
	Index test	z	Sensitivity % (95 % CI)	Specificity % (95% CI)	DOR (95% CI)	Positive LR (95% CI)	Negative LR (95% CI)
Ovarian volume (OV) Cutoff value	≥10 cm ³	ъć	82.56 (68.83–91.03)	78.95 (67.26–87.25)	17.75 (8.65–36.44)	3.92 (2.24–6.87)	0.22 (0.14–0.34)
Age groups	< 10 CM ⁻ 20 years old ~ 30 years old	1 4 1 7 7 7	80.74 (74.54-85.71) 75.58 (64.62-83.98) 83.63 (77.19-88.52)	82.01 (/4.01–8/.93) 73.31 (59.19–83.88) 83 77 (77 40–88 61)	19.11 (10.01–36.46) 8.50 (4.26–16.96) 26 36 (15 11–45 99)	4.49 (3.24-6.21) 2.83 (1.96-4.10) 5 15 (3.65-7 28)	0.23 (0.16-0.35) 0.33 (0.21-0.53) 0.20 (0.14-0.28)
BMI groups	<pre>>>0 kg/m²</pre> <pre></pre>	τς τ	84.78 (79.75–88.73) 81 91 (74 32–87 63)	77.82 (54.55–91.11) 85 78 (77 39–91 40)	20:00 (10:11 - 10:00) 19:53 (6:33-60:31) 27:31 (12:33-60:52)	5 76 (3 79–8 75)	0.20 (0.13 0.20) 0.20 (0.08-0.49) 0.21 (0.13-0.34)
Geography	North America Europe	¦4∩	75.84 (67.50–82.59) 83.30 (72.83–90.27)	72.98 (65.03–79.69)* 87.96 (80.58–92.79)*	8.48 (5.82–12.35)* 36.44 (19.59–67.77)*	2.81 (2.16–3.65)* 6.92 (4.16–11.52)*	0.33 (0.26-0.42) 0.19 (0.12-0.30)
Diagnostic criteria	Asia 1990 NIH	<u>∼∞∘</u>	86.53 (74.74–93.31) 77.48 (71.67–82.39) 87.64 (77.62, 05.53)	82.68 (69.05–91.08) 78.41 (71.18–84.22) 85.45 (77.88 07.77)	30.67 (9.95–94.59) 12.50 (8.33–18.74) 41 E4 (14 E0 110 26)	5.00 (2.59–9.64) 3.59 (2.86–4.51) 6.00 (2.36–4.51)	0.16 (0.08–0.32) 0.29 (0.22–0.38) 0.11 (0.07 0.20)
Transducer frequency	≥8 MHz ≥8 MHz	001	0.01 (//.02-33.72) 79.17 (73.65-83.79) 86 70 (72 76-94 09)	79.38 (72.08-85.16) 79.38 (72.08-85.16) 84.54 (70.90-92.47)	41.34 (14.33-116.20) 14.63 (9.39-22.80) 35 66 (10 34-122 97)	0.02 (3.20-11.13) 3.84 (3.02-4.87) 5 61 (7 60-17 09330)	0.14 (0.07-0.23) 0.26 (0.19-0.36) 0.16 (0.08-0.32)
Methodology	2D real time	, 11 v	82.53 (75.27-87.99) 78 99 (69 64-86 04)	80.11 (71.80–86.43) 80.12 (71.80–86.43) 83 12 (72 41–90 24)	19.02 (11.03–32.82) 19.02 (11.03–32.82) 18.52 (6.53–52.51)	4.15 (2.95–5.83)	0.22 (0.15-0.31)
Risk of bias	High risk Low risk	о 🗄 с	76 88 (70 06–82 53) 76 88 (70 06–82 53)	23.12 (7.2.11 20.21) 78.17 (70.70–84.16) 86.56 (82 70–89.66)	17.68 (9.83–31.81) 21 41 (13 51–33 95)		0.22 (0.15-0.31)
Adolescent studies	Total TAUS	04 M	81.84 (75.74–86.68) 83.77 (77.90–88.31)	83.54 (77.06–88.46) 81.88 (74.56–87.45)	22.87 (13.16–39.74) 22.332 (13.10–41.54)	4.97 (3.62–6.82) 4.62 (3.36–6.37)	0.22 (0.15-0.31) 0.20 (0.14-0.29)
	Index test	z	Sensitivity $\%$ (95 $\%$ CI)	Specificity $\%$ (95 $\%$ CI)	DOR (95% CI)	Positive LR (95% CI)	Negative LR (95% CI)
Follicle number per cross-section (FN Age groups BMI groups	tPS) ≥30years old <30years old ≥30kg/m² <30kg/m²	0 0 0 0	89.54 (81.83-94.21)* 70.14 (58.51-79.64)* 82.37 (65.78-91.91) 77.80 (60.74-88.81)	79.98 (62.36–90.59) 86.58 (79.71–91.37) 88.00 (74.57–94.83) 80.87 (76.37–84.68)	34.21 (11.50–101.71) 15.15 (8.87–25.87) 34.29 (9.57–122.88) 14.81 (6.27–35.01)	4.47 (2.65–7.54) 5.22 (3.50–7.80) 6.87 (3.09–15.25) 4.07 (2.09–7.90)	0.13 (0.06–0.29) 0.34 (0.25–0.48) 0.20 (0.09–0.43) 0.27 (0.21–0.36) (continued)

Table 3. Subgroup analysis of diagnostic accuracy of ultrasonographic markers to detect PCOS.

Table 3. Continued

	Index test	z	Sensitivity % (95% CI)	Specificity % (95% CI)	DOR (95% CI)	Positive LR (95% CI)	Negative LR (95% CI)
Methodology	2D real time	2	83.17 (70.52–91.08)	79.27 (70.99–85.66)	18.89 (11.33–31.49)	4.01 (2.38–6.77)	0.21 (0.16-0.28)
3	Offline	2	71.30 (62.08–79.03)	95.10 (65.16–99.51)	48.17 (4.48–518.13)	14.54 (6.67–31.70)	0.30 (0.06–1.60)
Risk of bias	Total	4	82.70 (75.15–88.31)	81.07 (70.10–88.67)	20.47 (12.69–33.02)	4.37 (2.80–6.81)	0.21 (0.15–0.29)
	Low risk	ε	80.55 (65.70–89.95)	90.92 (78.95–96.40)	41.49 (11.90–144.68)	8.88 (4.29–18.36)	0.21 (0.10–0.47)

DOR: diagnostic odds ratio, LR: likelihood ratio. * Significant difference between stratified groups (bolded).

of antral follicles (Dewailly *et al.*, 2014b; Teede *et al.*, 2018a). However, there were no differences in diagnostic accuracy due to transducer frequency for both FNPO and OV. Test methodology separated studies that used conventional real time approaches versus offline analysis. Offline analysis for FNPO improved the LR+ compared to real time approaches, however, there are only a limited number of studies using offline methods (Table 3). In addition, stratification by methodology also did not improve diagnostic accuracy for OV. For adolescent studies, one study (Chen *et al.*, 2008b) used both transabdominal and transrectal ultrasonography to evaluate ovarian morphology. Subgroup analysis for studies that exclusively used transabdominal ultrasonography did not change the diagnostic accuracy of OV.

Given that almost all studies had high risk of bias for the Patient Selection and Index Test domains of QUADAS-2, risk of bias was stratified with studies at 'High Risk' if they also had a high risk of bias grade for the Reference Standard and/or Flow and Timing domains. Exclusion of 'High Risk' studies did not improve diagnostic accuracy for FNPO, OV, or FNPS.

Discussion

Main findings

The present systematic review and diagnostic meta-analysis of 20 studies in adult women, comprising of 3883 control participants and 3859 women with PCOS, indicate that FNPO is the most accurate marker for the diagnosis of PCOS on ultrasonography. OV and FNPS have comparable diagnostic accuracy for PCOS yet show poorer performance compared to FNPO. As such, OV and FNPS should be used as alternative diagnostic markers when accurate measurement of FNPO is not possible. In addition, the systematic review identified four adolescent studies consisting of 210 control participants and 268 girls with PCOS. Pooled diagnostic measures suggest that OV in adolescents may offer comparable accuracy to OV in adults. However, the currently available data are limited and lack the ability to conduct diagnostic meta-analysis on other ovarian markers, such as follicle counts. Subgroup analysis suggests that stratification based on previously proposed diagnostic thresholds, age, BMI, and transducer frequency did not improve diagnostic accuracy for FNPO and OV. However, diagnostic accuracy for FNPO improved when stratified for studies diagnosing PCOS using the Rotterdam criteria versus the 1990 NIH criteria or when stratified for studies using offline follicle counting versus real time methods. There were substantial differences in diagnostic accuracy between geographic regions, with North American studies having poorer diagnostic accuracy compared to Asian and European studies for FNPO and OV, respectively. Comparisons of study characteristics across geographic regions suggest that differences in age, BMI, and diagnostic criteria may indirectly underlie the observed differences in diagnostic accuracy. Overall, these observations highlight the utility of various ultrasonographic markers of PCOM in the diagnosis of PCOS. Nevertheless, it should be noted that most included studies were at high risk of bias owing primarily to the non-randomized, observational study design, and lack of comparisons of diagnostic accuracy with previously proposed thresholds. Standardization and refinement in the conduct, assessment and comparison of PCOM is critical in facilitating a more accurate evaluation of PCOS and investigating phenotypic variations in the pathogenesis of the condition.

Strengths and limitations

Strengths of this study included a comprehensive database search and the use of recommended statistical approaches for

evaluating diagnostic test accuracy studies. In addition, we employed analyses on various study-level variables known to influence ovarian ultrasound markers and their diagnostic accuracy to identify potential sources of heterogeneity that could be leveraged for future research or guide improvement in current practice. Risk of bias and concerns regarding applicability were evaluated using a quality assessment tool specifically designed for diagnostic test accuracy studies. A primary limitation of this diagnostic meta-analysis was the lack of proposed summary thresholds for any ultrasonographic marker. The inability to determine a common threshold to define PCOM was primarily due to the heterogeneity across studies and limited data comparing previously recommended thresholds and those proposed within studies. In addition, we were unable to conduct a diagnostic meta-analysis for stromal features given the limited number of studies and variety of features proposed. Our subgroup metaanalysis integrated aggregated data made available publicly or upon request by investigators but remained limited in its inability to comprehensively evaluate the impact of confounders on diagnostic accuracy. Our search strategy included English-only studies and did not include any grey literature databases. Therefore, relevant diagnostic test accuracy studies written in other languages or non-peer reviewed data may have been omitted from the list of included studies.

Comparison with existing literature

Our observations affirm the recommendations set by the 2018 International Guideline (Teede et al., 2018a) and the 2014 AE-PCOS Task Force Report (Dewailly et al., 2014b) for ultrasonographic ovarian features in the context of PCOS diagnosis in adult women. Our findings support the use of FNPO as the gold standard ovarian marker for the diagnosis of PCOS. Furthermore, we corroborated previous recommendations of OV as a robust alternative to FNPO. Current evidence attributes PCOM to an excess of antral follicles, driven primarily by the accumulation of small 2-5 mm follicles (Jonard et al., 2003; Webber et al., 2003; Maciel et al., 2004; Christ et al., 2015). Although enlarged OV has been widely observed in women with PCOS (Balen et al., 2003; Carmina et al., 2005; de Guevara et al., 2013), OV has not been shown to consistently reflect the severity of reproductive dysfunction in PCOS (Christ et al., 2015) which aligns with its reduced discriminatory power. However, OV still offers strong diagnostic potential in the context of varying technology across routine practice and in situations when poor ultrasound image quality prevents accurate follicle counting (Dewailly et al., 2014b). In addition, we found that FNPS offers similar diagnostic accuracy compared to OV. FNPS was not previous recommended in the PCOM diagnostic criterion (Dewailly et al., 2014b; Teede et al., 2018a) but our findings show promise of using FNPS as an alternative to detect follicle excess when counting across the entire ovary is unavailable. Both OV and FNPS offer similar or better inter-rater reliability compared to FNPO, highlighting their value as alternative markers (Lujan et al., 2008). That said, the limited number of studies evaluating the diagnostic utility of FNPS indicate a need for further research. Our findings also suggest that OV may potentially be a robust ovarian marker for PCOS diagnosis in adolescent girls. However, current evidence remains limited owing to variations in diagnostic criteria (1990 NIH, Rotterdam) and ultrasonography methods (transabdominal, transrectal) used across the studies. In addition, the 2018 International Guideline does not recommend the use of ovarian ultrasonography in individuals <8 years post-menarche owing to the high incidence of PCOM and increasing ovarian size during this life stage (Teede et al., 2018a; Peña et al., 2020). With the absence of large longitudinal

studies to validate normative ranges of ovarian development during the adolescent transition, it may be premature to propose the use of ultrasonography in evaluation of adolescents with suspicion for PCOS.

The use of a transducer frequency ≥ 8 MHz has been previously recommended to ensure maximal detection of 2-9 mm antral follicles (Dewailly et al., 2014b; Teede et al., 2018a). We had anticipated that studies whose transducer frequency included ≥8 MHz would have improved diagnostic accuracy for FNPO. However, our data found that diagnostic accuracy for FNPO was unaffected after stratification for presumably older (<8 MHz) versus newer (\geq 8 MHz) imaging technology. This discrepancy may be due to the lack of reliability of conventional real-time counting methods between observers. Previous studies have shown that counting the high number of follicles in polycystic ovaries in real time has moderate to poor reliability between raters (Lujan et al., 2008, 2009) and can significantly misclassify ovaries as having PCOM (Vanden Brink et al., 2021) even when higher resolution transducers are used. As such, detection of more follicles with newer imaging technology may not necessarily yield a more accurate analysis of PCOS and standardized methodology in follicle counting is required for greater reliability across clinicians and researchers.

Modeling from cross-sectional and longitudinal follow up studies has shown that the prevalence of PCOM and measurements of follicle counts and ovarian size decline with age in women with PCOS (Hudecova et al., 2009; Glintborg et al., 2012; Wiser et al., 2013; Ahmad et al., 2018; Jacewicz-Święcka et al., 2021; van Keizerswaard et al., 2022). As such, development of agespecific diagnostic thresholds for PCOM in women of reproductive age have been recommended by the 2018 International Guideline (Teede et al., 2018a) with several having been proposed to date (Kim et al., 2017; Lie Fong et al., 2017; Ahmad et al., 2019). However, our diagnostic meta-analysis found that age did not play a substantial role in the heterogeneity of diagnostic accuracy across studies for FNPO and OV when studies were stratified into age groups of \geq 30 or <30 years old. It should be noted that the weighted mean age for the PCOS and control populations across all studies for FNPO (PCOS: 26.30 ± 1.68 years old; Control: 30.43 ± 2.82 years old), OV (PCOS: 27.06 ± 3.44 years old; Control: 28.86±4.47 years old), and FNPS (PCOS: 27.90±4.69 years old; Control: 27.20±4.80 years old) were relatively young, and few studies were available to capture individuals \geq 30 years old. Consequently, this limited range of age across studies likely accounted for the failure to detect an impact of chronological age on diagnostic accuracy.

Similarly, we also found that stratification based on BMI did not directly account for any heterogeneity in diagnostic accuracy across ultrasonographic markers. Previous studies on healthy women with obesity indicate that FNPO did not differ when compared to their leaner counterparts (Roth et al., 2014; Moslehi et al., 2018) despite evidence of a negative association between BMI and ovarian morphology markers (Moslehi et al., 2018; Peigné et al., 2018; Kazemi et al., 2020; Neubronner et al., 2021). The relationship between adiposity and FNPO in the context of PCOS is more controversial, with studies indicating a significant association but uncertainty as to its directionality and specificity in follicle subpopulations (Jonard et al., 2003; Christ et al., 2015; Moslehi et al., 2018; Peigné et al., 2018; Neubronner et al., 2021). However, our observations support previous evidence that OV is not influenced by BMI in either healthy women (Malhotra et al., 2013; Neubronner et al., 2021) or women with PCOS (Christ et al., 2015; Neubronner et al., 2021).

We found that geographic differences may underlie some of the heterogeneity in diagnostic accuracy of ultrasonographic markers observed across studies. We noted variation in the manifestation of PCOM across regions that could potentially impact discriminatory power. In the case of FNPO, we noted higher FNPO in North American studies relative to European and Asian studies suggestive of greater potential for follicle excess in this geographic region. Our findings of higher follicle count in North American PCOS populations versus European populations aligns with previously reported differences in FNPS between Caucasian women with PCOS from Boston compared with those from Iceland (Welt et al., 2006). Likewise, our finding of lower FNPO in Asian PCOS populations corroborate other reports from East Asia (Lee et al., 2015; Han et al., 2017) as well as comparisons of FNPS between North American-based Asian populations and other ethnicities (Welt et al., 2006). In contrast, our data showed no differences in OV across geographic regions and differs from previously reported findings (Welt et al., 2006; Lee et al., 2015; Han et al., 2017). It should be noted that the observed geographic differences in diagnostic accuracy may be partially due to differences in the PCOS diagnostic criteria. North American studies exclusively used the 1990 NIH criteria whereas the Asian studies preferably used the Rotterdam criteria. We found that the increased sensitivity in Asian versus North American studies aligned with similar results observed when comparing Rotterdam versus 1990 NIH subgroups for FNPO. However, the increased diagnostic accuracy measures in European versus North American studies for OV did not share the same pattern.

Age and BMI may have also contributed to the observed differences in diagnostic accuracy between geographic groups. We noted that the PCOS population in Asian studies was younger and leaner than those in North American studies when comparing FNPO. This observation aligns with previous comparisons between Caucasian and Asian women with PCOS (Welt *et al.*, 2006; Chan *et al.*, 2017). Furthermore, one study that matched for age and BMI to compare ethnicity alone between North American Caucasian and Asian women reported no differences in prevalence of PCOM (Wang *et al.*, 2013). These findings suggest that geographic variation, which may include a variety of potential factors, contributes to differences in ovarian morphology and, by extension, diagnostic accuracy in PCOM.

Implications for clinical practice

Our findings reinforce the use of FNPO as the superior ultrasonographic marker in the diagnosis of PCOS (Teede et al., 2018b). However, there remains room for improvement regarding standardization of best practices in obtaining FNPO to ensure that accuracy is maintained across clinicians and researchers, settings and technology. We also found OV and FNPS to be alternatives with good diagnostic performance if total follicle counts cannot be accurately evaluated (e.g. in the case of poor image quality or low transducer frequency). In particular, FNPS offers promising utility as a proxy for FNPO that can be obtained quickly using a single slice of the ovary; however, further evidence is required to validate these findings. Likewise, there may be potential to establish a PCOM criteria for adolescents as more data becomes available. Despite the clinical heterogeneity and limited quality across studies, the sensitivity and specificity of the observed ovarian ultrasound markers remained generally consistent and highlights their utility for accurately capturing PCOS.

Implications for future research

Given the heterogeneity across studies, standardization in the evaluation of ultrasonographic ovarian features is required to

ensure a more accurate diagnosis of PCOS. Although real time follicle counting remains the conventional method, it has been shown to exhibit moderate to poor inter-rater reliability across clinicians when evaluating polycystic ovaries (Lujan et al., 2008, 2009). Indeed, our subgroup analysis suggests that alternative approaches, such as offline analysis, may have a greater likelihood of detecting PCOS although there remains a limited number of studies. Several approaches in follicle counting have been explored toward improving standardization and reproducibility, including formal training workshops across clinicians (Lujan et al., 2008) or the use of a grid overlay in either offline (Lujan et al., 2010) or real time follicle counting (Vanden Brink et al., 2021). With the advent of new ultrasound technology, 3D follicle counting has also been strongly considered, albeit few data are available in the context of PCOS diagnosis (Allemand et al., 2006; Battaglia et al., 2012; Kar and Swoyam, 2018). Compared to 2D approaches, inter-observer reliability is improved when using 3D follicle counting methods such as multiplanar view (MPV) allowing for simultaneous visualization of follicles across three perpendicular axes (Mercé et al., 2005; Jayaprakasan et al., 2007, 2008; Deb et al., 2009) or automated 3D volume reconstruction software (e.g. SonoAVCTM) (Jayaprakasan et al., 2008; Deb et al., 2009). Real time and offline MPV may offer a clinically feasible method as they provide similar FNPO for both PCOM and non-PCOM ovaries compared to gold standard approaches (Vanden Brink et al., 2021). In contrast, semi-automated follicle count software, such as SonoAVCTM, remains a challenge given its requirement of post-automation processing and systematic undercounting of follicles (Deb et al., 2009; Vanden Brink et al., 2021). Future studies should determine standardized approaches in 3D follicle counting of polycystic ovaries to evaluate their inter-observer reliability and subsequent diagnostic accuracy compared with conventional 2D methods.

Although we found that stratification based on age and BMI did not account for heterogeneity in diagnostic accuracy across markers, future research should identify opportunities to investigate diagnostic test accuracy of ovarian ultrasound markers in a large population of women with PCOS across the age and adiposity spectrum. Thus far, studies that propose age-specific diagnostic thresholds for PCOM are based on a small number of women older than 35 years in their study population (Alsamarai et al., 2009; Kim et al., 2017; Lie Fong et al., 2017; Ahmad et al., 2019). In addition, future research should evaluate how ultrasonographic ovarian markers differ across the BMI spectrum and their implications on the diagnosis of PCOS via BMI-stratified thresholds. Thus far, adjustment for BMI in the detection in PCOS has only been evaluated with anti-Müllerian hormone (AMH) (Palomaki et al., 2020) and has not been assessed with ultrasonographic markers of PCOM. Although several studies have compared prevalence of PCOM across different ethnicities and geographic regions (Glintborg et al., 2010; Wang et al., 2013; Chan et al., 2017), only one study has directly compared ultrasonographic ovarian markers (Welt et al., 2006). Further research should prospectively conduct comparisons of age- and BMI-matched PCOS populations across different geographical regions to evaluate differences in ovarian morphology. Specifically, integration of raw data across multiple clinical and research sites around the world would allow for individual patient data meta-analysis that can directly inform the impact of underlying confounders and their independent associations to diagnostic accuracy.

Ultrasonographic ovarian measurements were presented either as the maximum value or average value between the two ovaries. It has been shown that there is little variation in leftright differences in FNPO (Jarrett et al., 2019) and either would be a concordant marker if only one ovary is visible. However, there are significant left-right differences in OV and FNPS leading to ovary-specific diagnostic thresholds (Jarrett et al., 2019). Consensus is therefore required across researchers and clinical settings on ways to present ovarian ultrasound data to improve standardization and reliability. In addition, nomenclature of ultrasonographic markers should be addressed. Although FNPO is broadly accepted to denote follicle counts across the entire ovary, antral follicle count (AFC) has been used as an equivalent term. However, AFC can also indicate the total sum of follicles in both ovaries and is commonly used in the context of reproductive medicine, including for measurement of the ovarian reserve (Rosen et al., 2012), in vitro fertilization outcomes (Jayaprakasan et al., 2012) and predicted response to ovarian stimulation (Nastri et al., 2015). Consensus is required as to which term should be used in the context of PCOS diagnosis and evaluation.

Most of the included studies were graded high risk of bias due in their patient selection and index test methodology. In particular, all studies were observational in design and only one used consecutive sampling (Dewailly et al., 2011). Further evaluations in diagnostic test accuracy should utilize random sampling from a larger study population or consecutive sampling across clinical or research settings. Raters interpreting ultrasound ovarian markers should be blinded of the participant's phenotype. Our findings indicated that including PCOM as part of the Rotterdam criteria could exaggerate the diagnostic accuracy of FNPO. However, using the 1990 NIH criteria to diagnose PCOS only captures those with the most severe manifestation of PCOS in terms of reproductive and metabolic dysfunction (Diamanti-Kandarakis and Panidis, 2007; Kauffman et al., 2008; Clark et al., 2014). Therefore, ultrasound image analysis blinded and conducted prior to phenotyping is critical in reducing bias associated with the inclusion of PCOM in the PCOS diagnosis of the study population. Lastly, the presence of varying thresholds across all studies provided additional heterogeneity in determining diagnostic accuracy (threshold effect) and subsequently prevented a determination of the most accurate cutoff to diagnose PCOS. Future studies should report diagnostic accuracy measures across multiple thresholds, including previously recommended cutoffs, and pool individual patient data across large datasets to facilitate more robust diagnostic meta-analysis.

Conclusion

This systematic review and diagnostic meta-analysis confirms that FNPO is the most accurate ultrasonographic marker in the diagnosis of PCOS in adults, with OV and FNPS as alternatives when accurate total follicle counts are not possible. Standardization of best practices in follicle counting is required to ensure accurate measurements across users, settings, and technology. Although stratification based on age and BMI did not substantially account for the heterogeneity observed in diagnostic accuracy across markers, geographic variation across studies may influence differences in diagnostic accuracy in FNPO and OV. Weaknesses in study designs, such as patient selection and index test methodology, limit the strength of the evidence, and conclusions. In addition, more data are needed to support any ultrasonographic criterion for PCOS in adolescents. However, our findings serve as a foundation for well-designed studies toward a standard definition of PCOM and will inform future guideline recommendations. These efforts are essential for a more accurate evaluation of PCOS and for future investigations of the variable

pathogenic mechanisms that underlie phenotypic differences in this condition.

Supplementary data

Supplementary data are available at Human Reproduction Update online.

Data availability

The data underlying this article are available in the article and its online supplementary material.

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None.

Authors' roles

J.P. conceived and designed the study. J.P., J.B., C.W., and K.G. conducted systematic database searches. J.P., A.L.O., and C.W. performed the risk of bias and applicability assessment. J.P., J.B., F.E.C., C.W., and K.G. extracted data and J.P., J.B., A.L.O., F.E.C., L. M.J., and M.E.L. reviewed the collated data. J.P. conducted the statistical analysis with contributions from L.M.J. J.P., L.M.J., and M. E.L. contributed to the data interpretation. J.P. and M.E.L. wrote the manuscript and J.B., A.L.O., F.E.C., C.W., K.G. and L.M.J. edited the manuscript.

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Conflict of interest

The authors have no conflict of interest to disclose.

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