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7	Diagnostic Test Accuracy of the YEARS Algorithm for Pulmonary
8	Embolism
9	A systematic review and meta-analysis
10	*Sean R. Te Haara, ¹ Helena De Rezende, ² Chao Wang ³
11	
12	¹ Specialist Assets and Resilience, London Ambulance Service, London, United Kingdom;
13	² Department of Nursing Science, Bournemouth University, Bournemouth, United Kingdom; ³ Centre
14	for Health and Social Care Research, School of Education, Midwifery and Social Work, Kingston
15	University, Kingston upon Thames, United Kingdom.
16	*Corresponding Author's e-mail: stehaara@outlook.com
17	
18	Abstract
19	This systematic review and meta-analysis aimed to evaluate both the diagnostic test accuracy
20	of the YEARS algorithm in excluding pulmonary embolism and to compare the advance
21	imaging utilisation rate of YEARS against standard practice. Published studies were selected
22	across several databases from July 2017 to September 2022 using Joanna Briggs Institute
23	methodology for systematic reviews of diagnostic accuracy. The analysis included ten studies
24	with nearly 14,000 participants. YEARS showed a sensitivity of 96% (95% CI 93-98%) and
25	specificity of 50% (95% CI 33-67%). The risk ratio for advanced imaging was 0.78 (95% CI
26	67-90), showing an overall reduction. YEARS is an effective means of safely managing
27	patients with suspected pulmonary embolism.
28	Keywords: Pulmonary Embolism; Diagnostic Imaging; Fibrin Fragment D; Meta-Analysis;
29	Systematic Review; Fibrin Fibrinogen Degradation Products; Clinical Decision Rules.
30	
31	Introduction
32	Pulmonary Embolism (PE) carries an incidence between 39-115 per 100,000 people and is
33	the third most common cardiovascular cause of death worldwide. ^{1,2} The presentation of PE,
34	though sometimes causing overt cardiovascular compromise, can often be non-specific. For
35	this reason, PE is not uncommon yet can be difficult to diagnose leading to over-

- 36 investigation, inappropriate diagnosis, prolonged use of Emergency Department (ED)
- 37 resources and inappropriate treatment.³⁻⁵ Evidence shows a recent rise in the use of
- 38 emergency resources to investigate PE compared to previous decades.^{6,7} Despite this increase
- in investigation and diagnosis of PE, the overall mortality has not significantly changed.^{3,8}
- 40

To help with diagnosing patients with suspected PE whilst avoiding the unnecessary use of 41 42 Advanced Imaging (AI), several algorithms have been developed. The YEARS algorithm was first published in the Lancet on May 2017.⁹ The algorithm used an abbreviated version 43 of the WELLS algorithm consisting of three criteria: clinical signs and symptoms of Deep_ 44 Vein Thrombosis (DVT), likely diagnosis of PE, and the presence of haemoptysis. Patients 45 46 are classified as either having a low (no criteria present) or high (one or more criteria present) pre-test probability of having PE. Based on this pre-test probability, a lower or higher D-47 48 dimer decision threshold, 500 ng/ml or 1000 ng/ml respectively, is used to categorize patients as low risk (not requiring AI) or high risk (requiring AI). YEARS is presented in Figure 1. 49 The algorithm had a sensitivity of 98%, specificity of 55%, positive predictive value 25%, 50 negative predictive value 99%.9 51

52

The gold standard in AI for diagnosing PE is Computed Tomography Pulmonary 53 Angiography (CTPA).^{10,11} This method carries several risks to the patient such as cancer 54 development secondary to radiological exposure,¹² as well as the risk of nephrotoxicity and 55 anaphylaxis from the required intravenous contrast.¹³ Additionally, Computer Tomography 56 (CT) scans are not always readily available and a reduction in their use would likely lead to 57 budgetary savings and better use of emergency resources.¹⁴ Alternative AI modalities exist 58 which can modify patient risk but do not negate them entirely.¹⁵ This calls into question the 59 liberal use of AI on patients with a low or insignificant chance of having PE.¹¹ Thus, we pose 60 the following question, what is the diagnostic test accuracy and utility of the YEARS 61 algorithm at excluding PE? 62

63

A preliminary search on CINAHL Plus and Medline revealed one systematic review on this
topic. The review analysed four different algorithms (one of which being YEARS) within
four specific patient sub-groups.¹⁶ Furthermore, this previously published review
retrospectively implemented its own study protocol on cohorts from various studies and
compared three different clinical decision rules to YEARS.¹⁶ In light of this evidence, we
aimed to evaluate the accuracy of YEARS in excluding PE and compare YEARS' AI
utilisation rate against standard practice. Our review proposes to broaden this theme as our

- 71 included studies differed in our cohort population and study design. Furthermore, our
- 72 outcome metrics differed from their singular use of missed PE and included sensitivity,
- 73 specificity, likelihood ratios and predictive values.
- 74

When evaluating an algorithm designed to exclude PE whilst negating AI use, patient safety 75 is fundamental. This will be demonstrated by estimating both the likelihood of missed PE 76 77 and the incidence of AI exposure. When analysing the utilisation rate of AI, a reference test will be used to demonstrate either an increase or decrease. The reference test will be termed 78 79 standard practice and may include any alternative algorithms for investigating suspected PE (for example the WELLS algorithm). The objectives of this study are to evaluate the 80 81 accuracy of YEARS in excluding PE defined as the sensitivity, specificity, likelihood ratios and predictive values. Additionally, to compare the AI utilisation rate of YEARS against 82 standard practice via calculation of the associated risk ratio. 83 84 Methods 85 We followed the Joanna Briggs Institute (JBI) methodology for systematic reviews of 86 diagnostic test accuracy.¹⁷ Moreover, the study was reported using the Preferred Reporting 87 Items for Systematic review and Meta-Analysis (PRISMA) guidelines and the PRISMA of 88 diagnostic test accuracy as an extension.^{18,19} 89 90 Inclusion Criteria 91 The Population, Index test, Reference test and Diagnosis of interest (PIRD) model was 92 utilised to develop the inclusion and exclusion criteria.^{17,19} 93 94 *Population:* Suspected PE in individuals aged 16 years or older of any ethnicity or gender; 95 96 living in any geographical location. Studies conducted in ED, inpatient, and outpatient departments were included. Studies involving pregnant participants were excluded. 97 98 Index Test: The original YEARS algorithm with D-dimer decision thresholds of 500 ng/ml or 99 1000 ng/ml respectively depending on YEARS score. 100 101 Reference Test: A reference test is required to detect true/false PE. This will include either 102 unilateral validation via AI or alternatively, prospective implementation of YEARS with 103 104 three-month participant follow up if no AI is ordered (as is commonly utilised in the Venous

- Thromboembolism [VTE] literature). The use of alternative PE algorithms were used as a 105 reference test to assess the rate of AI utilisation. 106 107 Diagnosis of Interest: Any thromboembolism within the pulmonary circulatory tree as 108 diagnosed on AI/autopsy. This review shall not delineate between Isolated Sub-segmental 109 Pulmonary Embolism (ISPE) and PE to improve homogeneity across all studies. 110 111 Subsequently, DVT (without PE) will not be counted as missed PE. 112 Study Design: randomised control trials, case-controlled studies, cross-sectional studies, and 113 retrospective or prospective cohort studies published in peer reviewed journals were 114 included. Studies which conducted post-hoc analysis upon literature already included for 115 review was excluded to avoid repetition of synthesised outcomes. 116 117 Search Strategy 118 The search strategy was developed with the input of the librarian and the following terms 119 were applied to the databases: ("pulmonary embol*" OR "pulmonary thromboembol*" OR 120 "fibrin split product*" OR "Fibrin degradation product*" OR "D-dimer") [TI, AB] AND 121 ("years score" OR "years study" OR "years algorithm" OR "years tool" OR "years criteria" 122 OR "vears rule" OR "vears clinical decision" OR "vears diagnostic") [TX] 123 124 An initial limited search (Step 1) was performed in Medline (EBSCO host, Birmingham, 125 Alabama, USA) in order to identify key words and indexed terms. This informed the 126 development of a comprehensive search strategy (listed above) which was adapted for each 127 database searched (Step 2). The databases used to collate studies were CINAHL Plus 128 (EBSCO host, Birmingham, Alabama, USA), AMED (EBSCO host, Birmingham, Alabama, 129 USA), Medline (EBSCO host, Birmingham, Alabama, USA), and EMBASE (Ovid 130 Technologies, Inc., New York, USA). 131 132 All studies published in English between July 2017 (the original publication date of the 133 YEARS algorithm) to September 2022 (date of database search) were included.⁹ Data was 134 managed using RayyanTM reference manager and Microsoft Excel Software^{TM 20,21} and was 135 assessed by two independent authors. Disagreements were resolved through discussion. 136
- 137

- 138 Assessment of Methodological Quality
- 139 Selected studies were critically appraised for methodological quality using the JBI checklist
- 140 for diagnostic test accuracy studies Critical Appraisal Tool CAT. This instrument is based
- 141 on 10 "signalling questions" from the revised Quality Assessment of Diagnostic Studies
- 142 (QUADAS-2) critical appraisal tool for diagnostic test accuracy.²² The four domains used to
- assess risk of bias included patient selection (questions 1 to 3), index tests (questions 4 and
- 5), reference standard (questions 6 and 7), and flow and timing (questions 8 to 10). This
- 145 provided objective appraisal of potential bias present within the included studies. All studies
- were included regardless of methodological quality and 20% of the total included studies
- 147 were quality assured between two authors with the remaining critiqued via a single
- 148 researcher.
- 149

150 Data Extraction

Data from selected studies was extracted by one author utilising a modified version of the Standards for Reporting Diagnostic accuracy studies (STARD) checklist to fit this reviews aims and objectives.²³ Two authors completed independent data extraction of a minimum 20% studies as quality assurance. Upon data collection, if required data was not made available we calculated the values from what was provided. If this was not possible authors of included studies were contacted to provide additional data.

157

158 Data Analysis and Synthesis

Data was synthesized using meta-analysis as described below. When meta-analysis was not 159 performed the synthesis without meta-analysis reporting guidelines were utilised.²⁴ We have 160 performed meta-analysis of the test accuracy in terms of sensitivity and specificity as per the 161 JBI methodology for systematic reviews of diagnostic test accuracy.¹⁷ The meta-analysis 162 results have been presented in a forest plot and summary receiver operating characterises 163 (ROC) curve.^{19,24,25} A hierarchical random-effects logit model was employed using Stata 164 package metadta.²⁶ In addition, we were interested in the impact of YEARS in terms of 165 reducing scans compared to other algorithms. We collected data from studies and performed 166 a meta-analysis of the risk ratio of YEARS incurring imaging. Profile likelihood method was 167 adopted as suggested by Kontopantelis and Reeves,²⁷ using the 'metan' package in Stata 168 18.²⁸ The result was again presented in a forest plot. In addition, subgroup analysis was 169 performed, to assess the heterogeneity between study design (prospective and retrospective) 170 regarding both outcomes: diagnostic test accuracy and impact on AI utilisation. Statistical 171 analysis mirrored the protocols described above and was presented via forest plots. This was 172

173 reasoned to be important as the difference in study design may be a significant contributing

- 174 factor of heterogeneity between articles.
- 175

176 **Results**

177 Study Inclusion

178 In total, 226 studies were retrieved and abstracts read. 25 papers were assessed for full-text

reading, for which 15 were excluded with reasons. Of these, six used YEARS as a screening

tool on patients diagnosed with another disease including chronic obstructive pulmonary

disease (COPD), sickle cell disease and coronavirus disease. This failed to meet the specified

- inclusion criteria of 'suspected PE' and is not how YEARS was intended to be applied. Four
- 183 combined YEARS with additional investigations such as the pulmonary rule-out exclusion
- 184 criteria rule or C-reactive protein studies and failed to meet the original YEARS protocol.
- 185 This left 10 papers included for the systematic review [supplementary material Figure 1].
- 186

187 *Characteristics of Included Studies*

In total, 13,993 participants were included across 10 studies^{9,29-37} with no one study making
up more than 25% of the total review cohort. Participants were recruited internationally
across 11 countries by way of 39 different hospitals. In total, 1.4% of the participants were

191 lost of follow up in two studies.^{9,31} Most participants were recruited within the ED.

192

The incidence of PE varied significantly between studies with an average incidence of 17.2% $(SD \pm 9.9\%)$. Only one study³⁵ included participants aged 16-17 years old compared to all other studies who opted for 18 years or older. Conversely, one study²⁹ excluded all participants under the age of 50 years. The key characteristics of the included studies is presented in Table 1.

198

199 Methodological Quality

All studies^{9,29-37} received critical appraisal with the average result equalling 8.5/10. No studies were at high risk for bias and only one study³⁵ appearing to be at moderate risk of bias: 7/10. A table with critical appraisal of the included studies is presented in Table 2. A description of how individual studies were scored for each of the 10 questions within the JBI critical appraisal tool is discussed below.

205

All studies^{9,29-37} incorporated consecutive enrolment of participants, avoided a case-control design, used the original YEARS and D-dimer decision threshold, interpreted the reference

test without knowledge of the index test and allowed for a suitable time between index and
reference tests (questions 1, 2, 5, 7, and 8). One study³² allowed for using venous
compression ultrasonography when investigating the presence of a DVT. However, this did
not alter the original YEARS algorithm hence this study was scored favourably on question
5.

213

In question 3, one study²⁹ implemented inappropriate exclusions by omitting all participants
under 50-years-old. In question 4, three studies^{9,30,31} interpreted the index test without
knowledge of the reference test. One study ⁹ did not blind clinicians to the D-dimer result
before participants had YEARS applied to them. This posed a risk of bias as clinicians knew
the result of YEARS before recruitment into the study.²⁵ Nevertheless, as the D-dimer is
separate to the reference test, this study⁹ was scored favourably (yes) for question 4.

220

One study³⁵ was identified as having the potential for missing PE upon review of their stated 221 reference test (question 6). This study retrospectively reviewed D-dimers ordered for 222 suspected PE and utilised a three-month follow up for patients who did not receive AI at their 223 initial visit. Three-month follow up was performed by reviewing for representation to the 224 same ED or further AI ordered. This sub-group made up 73.7% of the cohort. This follow up 225 was considered at higher risk of missing PE as direct patient follow-up was not performed. 226 Additionally, representation to an alternative ED in the area, for which several were 227 available, was not discussed. 228

229

In question 9, six of the studies^{29,30,33,34,36,37} uniformly received the same reference test as they were retrospective chart reviews of CTPA scans ordered for suspected PE. One study³¹ had a significant number of participants lost to follow up who did not undergo AI upon the index visit – 11% of total cohort (question 10). An additional study⁹ also documented participants lost to follow up; however, this number was minuscule compared to the cohort size (0.1%) and thus was scored positively.

236

237 *Review Findings*

Upon review, three studies^{9,30,32} required recalculation of their data to align with the protocol
of this review (see Table 1). In total, an incidence of 25 ISPE were identified, four of which
were negative via the YEARS algorithm. Further sub-group analysis was not possible due to
insufficient data. However, characteristics documented were malignancy, heart failure,
history of VTE, syncope, lower respiratory tract infections (including corona virus disease-

243 19), asthma, hormone replacement therapy and Chronic Obstructive Pulmonary Disease

244 245

246 Heterogeneity was observed in relation to the two different reference tests used for diagnosis.

247 These being either a mix of AI or three-month follow-up or unilateral use of AI. Both

strategies were deemed adequate to detect missed PE. Two studies ^{9, 31} prospectively utilised

a mix of AI or three-month follow-up depending on the result of YEARS, which, despite

causing heterogeneity held high value as it produced data within the live clinical

environment.^{25,38}

(COPD).

252

Sub-group analysis was performed to compare prospective vs. retrospective studies (two 253 groups) and it was found that there was little evidence of heterogeneity across the study 254 255 designs. This is suggested by the highly overlapped pooled 95% confidence intervals regarding sensitivity and specificity between the two groups (supplementary material Figure 256 2). The difference in sensitivity was small whereas greater deviation was observed for 257 specificity between different study types. Pooled outcomes observed upon sub-group analysis 258 of the efficacy of YEARS in terms of the risk ratio of advanced imaging utilisation was very 259 similar between the two groups (supplementary material Figure 3). Again, little or no 260 evidence of heterogeneity by study design was observed. 261

262

Given the lack of heterogeneity across the study designs, meta-analysis based on all studies 263 was presented in the main body of our paper. Figure 2 shows a forest plot demonstrating the 264 meta-analysis results of sensitivity and specificity.²⁶ Figure 3 shows the summary ROC plot 265 with effect-analysis.²⁶ The overall outcome metrics as per the first primary objective were 266 calculated: sensitivity = 96% (95% CI 93-98%) and specificity = 50% (95% CI 33-67%). The 267 268 sensitivity calculated via meta-analysis held a reassuringly narrow confidence interval suggesting good between-study reproducibility for this metric. This was not the case for the 269 270 specificity which held a wide confidence interval and was inconsistent. This is shown within the summary ROS plot where the prediction region suggests significant heterogeneity 271 between studies despite an identical decision-threshold being universally applied. Further 272 pooled statistics were calculated: positive and negative predictive values = 29% and 99% and 273 positive and negative likelihood ratios = 2.35 and 0.06.³⁹ 274 275

276 Six categories of reference tests were identified to compare rates of AI utilisation:

277 Dichotomized WELLS (D-WELLS), altered D-WELLS, three-tier WELLS, age-adjusted

three-tier WELLS, age-adjusted D-WELLS and clinical gestalt. Five studies^{9,29,33,35,36} utilised
the D-WELLS though one study,³³ despite inferring AI was reduced, did not supply
statistical data for this. The author was contacted however we were unable to resolve this

281 query.³³ The most commonly used reference test was D-WELLS whereas the one which

consistently faired the strongest against YEARS was age-adjusted D-WELLS.

283

Published online letters^{40,41} reported that the D-WELLS score used as a reference test in one 284 study³⁰ considered a positive result only if both a score greater than four in addition to a D-285 dimer level above 500 ng/ml was present. This deviates from any known version of WELLS 286 and would theoretically produce a lower rate of AI utilisation via the 'threshold effect'.⁴² A 287 published response to this letter from the authors ⁴¹ confirmed they do not support the use of 288 this altered D-WELLS for use in clinical practice. Because of this, data regarding AI 289 utilisation from this study³⁰ was not used for meta-analysis. In the case of both prospective 290 studies,^{9,31} the reference test was retrospectively applied to the same sample population. 291 292

Figure 4 shows the risk ratio of AI being required between YEARS and the reference tests 293 available.²⁶ The combined risk ratio of AI utilisation attributed to the use of YEARS was 294 0.78 (95% CI 0.67-0.90). This indicates YEARS decreased the risk ratio of AI being required 295 by 22%. The mean reduction of AI utilisation without effect analysis was 11%. Only one 296 study demonstrated a minimal increase in AI utility. As demonstrated the results between 297 studies were varied despite the overall gross reduction of scans which is signified by the 298 relatively wide confidence interval seen upon meta-analysis. Despite this, the confidence 299 interval of the combined data lay outside of the null effect indicating statistical significance. 300

301

302 Discussion

This systematic review evaluated the diagnostic test accuracy of the YEARS algorithm on nearly 14,000 patients. All participants were recruited using a probability sampling strategy via way of 48 different sampling events internationally (including sites used more than once within a different time period). Malignancy, respiratory or cardiac disease, respiratory tract infections, previous VTE, syncope and hormone replacement therapy – these were among the diverse cohort recruited and represent common challenges when investigating PE due to their increased risk of VTE and/or similar clinical presentations.¹

310

311 Upon review of the YEARS algorithm, the combined sensitivity and specificity was

demonstrated to be 96% and 50%. The confidence intervals shown in the forest plot suggests

the sensitivity to be largely consistent between studies. Several risks for potential bias were noted within studies risking over representation of the sensitivity and under representation of the specificity. This included a failure to blind clinicians to D-dimer levels in one study⁹ and seven studies^{29,30,32-34,36,37} being retrospective chart reviews of CTPA requests. It is unknown to what degree this review was affected by these variables, if at all.

318

319 In this review, the diagnostic test accuracy of YEARS has been shown to be effective for use in the clinical environment for safely excluding disease in suspected PE. In fact, if the missed 320 ISPE were excluded from the false negatives, for which emerging evidence may encourage, 321 the miss rate would be even lower than what was demonstrated in this review.^{43,44} When 322 analysing the ability to correctly detect disease on the other hand the specificity was largely 323 inconsistent and low. This was similar to the original YEARS study which found the 324 specificity to be only 5% more than this review.⁹ Despite this it can be reasonably 325 propositioned that the ability to avoid missing true PE is more valuable than the specificity. 326 The fear of missing PE has been acknowledged, at least in part, to be one of the driving 327 factors of over utilising AI and the avoidance of using clinical decision rules and 328 algorithms.^{7,45} One of the prospective studies ³¹ demonstrated a large proportion of patients 329 where AI was requested against the YEARS protocol. This highlights the presence of 330 mistrust felt by clinicians during clinical use. In relation to this, YEARS did hold a 331 reassuringly high sensitivity and low negative likelihood ratio of 0.06. In fact, the rate of 332 missed PE within the combined cohort was only 0.5%. This falls well short of the generally 333 accepted miss rate for PE of 2% indicating YEARS is likely safe for patient use when 334 considering the risk of missed PE.⁴⁶ 335

336

In combination to this proposition of a low miss rate, YEARS must also reduce unnecessary
AI ordering. In this regard YEARS also appeared to hold value as it demonstrated a decrease
of 22 percentage points in the risk ratio. This reduction is statistically significant. These
results suggest that YEARS is effective at reducing AI utilisation compared to several
different forms of alternative PE algorithms. As is demonstrated in the current literature of
PE, over-investigation with AI causes increased risk to both the patient and health care
system.^{6,7,12,13}

344

No significant selection bias was observed within the participant exclusion criteria listed
across all studies. Common exclusions were the presence of YEARS exclusion criteria such
as pregnancy, incomplete participant data, recent use of anticoagulants or a life expectancy

less than three months. A concession to this, though minimal in our opinion, was the
exclusion of participants aged 50 years or less in one small study.²⁹ Two sub-groups of
patients appeared at risk of falling below the acceptable level of reference testing for PE and

made up 12.6% of the total cohort. This was either participants lost during three-month

- follow up or participants who did not receive AI within one study ³⁵ due to the concerns
- 353 discussed during critical appraisal.
- 354

Regarding prospective vs. retrospective studies, retrospective analysis is often chosen in 355 studies of diagnostic test accuracy due to data being readily available.²⁵ This can present 356 risks for error when implementing a protocol compared to prospective implementation.²⁵ For 357 instance, one study³³ decided on whether PE was the most likely diagnosis retrospectively 358 from chart review, depending on whether the patient had a known disease which would 359 explain breathlessness (e.g. COPD). In practice however, the clinical acumen needed for this 360 decision is more complex. In spite of this, sub-group meta-analysis by study design 361 demonstrated minimal differences regarding outcomes. 362

363

Another point for consideration were studies which conducted sampling via retrospective data of CTPA ordered for suspected PE. Such studies may have recruited a proportionally higher cohort of individuals who were at high risk for PE compared to the 'typical' patient with suspected PE. To elaborate, it could be surmised that patients who received CTPA, ordered according to the local protocols, were more likely to have PE compared to patients who had PE excluded without CTPA (thus were not recruited). This could risk the results overestimating sensitivity and under estimating specificity.^{25,38}

371

Interestingly, out of the nine studies ^{9,29-31,33-37} which included comparative data of YEARS versus an alternative algorithm, seven^{9,29,31,33-36} indicated the YEARS algorithm did not produce the lowest rate of missed PE. It was not in the scope of this review to compare the diagnostic accuracy of YEARS against alternative algorithms; therefore, no comment can be made on the superiority or inferiority of YEARS concerning the diagnostic test accuracy within this review.

378

379 This review has several limitations. Studies published in languages other than English were

excluded. Furthermore, grey literature was not included.⁴⁷ A single researcher conducted

most of the data extraction and critical appraisal. To mitigate this risk, two authors were

consulted throughout the process and 20% of the included studies received calibration

383 exercises of critical appraisal and data extraction to moderate against error and discuss

384 discrepancies.⁴⁸

385

386 Conclusion

This review aimed to evaluate the diagnostic test accuracy YEARS when assessing patients 387 presenting with suspected PE. This review concluded that the YEARS algorithm holds a 388 389 sufficiently high sensitivity to avoid missing true PE. The specificity suggests YEARS has poor accuracy at detecting true PE (without AI). However, despite the relatively poor 390 specificity, the use of AI was reduced compared to other reference tests analysed. It was 391 demonstrated that the studies synthesised included a wide range of ages, demographics, and 392 genders, with variable medical histories and clinical presentations, in varied clinical settings. 393 This suggests that the results from this review can be applied to a wide range of patient 394 demographics seen in clinical practice. Further research on the implementation of YEARS 395 prospectively is needed to accurately demonstrate its outcomes on patient care during live 396 clinical use. As was discussed, the limitations of this review predominantly stemmed from 397 the use of retrospective study methodology. The future of investigating patients presenting 398 399 with suspected PE remains a common dilemma for clinicians. The YEARS algorithm has been shown to constitute a possible means of safely managing this patient demographic. 400

401

402 Authors' Contribution

SRTH conceptualized the study. SRTH and HDR designed the methodology and validation.
All authors were involved in the formal analysis, investigation, visualization and drafting of
the manuscript. SRTH handled the project administration. HDR supervised the work. All
authors approved the final version of the manuscript.

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408 **References**

- 409 1. Wendelboe AM, Raskob GE. Global Burden of Thrombosis: Epidemiologic Aspects.
 410 Circulation Res. 2016;118(9):1340–47.
- 411 https://doi.org/10.1161/CIRCRESAHA.115.306841.
- 412 2. Keller K, Hobohm L, Ebner M, Kresoja K-P, Munzel T, Konstantinides SV, et al. Trends
 413 in thrombolytic treatment and outcomes of acute pulmonary embolism in Germany. Eur
 414 Heart J. 2020;41(4):522–29. https://doi.org/10.1093/eurheartj/ehz236.
- 415 3. Moores LK. Are we overtreating isolated subsegmental pulmonary embolism?: first do
- 416 no harm. JAMA Intern Med. 2018;178(9):1274–75.
- 417 https://doi.org/10.1001/jamainternmed.2018.2970.

- 418 4. Bariteau A, Stewart LK, Emmett TW, Kline JA. Systematic Review and Meta-analysis of
- 419 Outcomes of Patients With Subsegmental Pulmonary Embolism With and Without

420 Anticoagulation Treatment. Acad Emerg Med. 2018;25(7):828–35.

421 https://doi.org/10.1111/acem.13399.

- 422 5. Van Der Hulle T, Kooiman J, Den Exter PL, Dekkers OM, Klok FA, Huisman MV.
- 423 Effectiveness and safety of novel oral anticoagulants as compared with vitamin K
- 424 antagonists in the treatment of acute symptomatic venous thromboembolism: a systematic
- review and meta-analysis. J Thromb Haemost. 2014;12(3):320–28.
- 426 https://doi.org/10.1111/jth.12485.
- 427 6. Dalen JE, Alpert JS. Diagnosis and Treatment of Pulmonary Embolism: What Have We
 428 Learned in the Last 50 Years? Am J Med. 2020;133(4):404–06.

429 https://doi.org/10.1016/j.amjmed.2019.08.049.

- 430 7. Wang RC, Miglioretti DL, Marlow EC, Kwan ML, Theis MK, Bowles EJA, et al. Trends
 431 in Imaging for Suspected Pulmonary Embolism Across US Health Care Systems, 2004 to
- 432 2016. JAMA Netw Open. 2020;3(11):e2026930.
- 433 https://doi.org/10.1001/jamanetworkopen.2020.26930.
- 8. Özsu SS, Durmuş ZG, Coşkuner MB, Bülbül Y, Öztuna F, Özlü T. Does the incidence
 and mortality of pulmonary thromboembolism change over the years? Turk Thorac J.
 2017;18(3):78–81. https://doi.org/10.5152/TurkThoracJ.2017.16050.
- 437 9. Van Der Hulle T, Cheung WY, Kooij S, Beenen LFM, Bemmel Tv, Van Es J, et al.
- 438 Simplified diagnostic management of suspected pulmonary embolism (the YEARS
- 439 study): a prospective, multicentre, cohort study. Lancet. 2017;390(10091):289–97.
- 440 https://doi.org/10.1016/S0140-6736(17)30885-1.
- 441 10. Konstantinides SV, Meyer G, Becattini C, Bueno H, Geersing G-J, Harjola V-P, et al.
 442 2019 European Society of Cardiology Guidelines for the diagnosis and management of
- 443 acute pulmonary embolism developed in collaboration with the European Respiratory
- 444 Society The Task Force for the diagnosis and management of acute pulmonary embolism
- of the European Society of Cardiology. Eur Heart J. 2020;41(4):543–603.
- 446 https://doi.org/10.1093/eurheartj/ehz405
- 447 11. The Royal College of Radiologists. iRefer: Making the best use of clinical radiology. 7th
 448 ed. London, UK: The Royal College of Radiologists; 2012.
- 12. Einstein AJ, Henzlova MJ, Rajagopalan S. Estimating risk of cancer associated with
- 450 radiation exposure from 64-slice computed tomography coronary angiography. JAMA.
- 451 2007;298(3):317–23. https://doi.org/10.1001/jama.298.3.317.

- 452 13. Rose Jr TA, Choi JW. Intravenous imaging contrast media complications: the basics that
- 453 every clinician needs to know. Am J Med. 2015;128(9):943–49.
- 454 https://doi.org/10.1016/j.amjmed.2015.02.018.
- 455 14. Phillips JJ, Straiton J, Staff RT. Planar and SPECT ventilation/perfusion imaging and
- 456 computed tomography for the diagnosis of pulmonary embolism: A systematic review
- 457 and meta-analysis of the literature, and cost and dose comparison. Eur J Radiol.
- 458 2015;84(7):1392–400. https://doi.org/10.1016/j.ejrad.2015.03.013.
- 459 15. Waxman AD, Bajc M, Brown M, Fahey FH, Freeman LM, Haramati LB, et al.
- 460 Appropriate Use Criteria for Ventilation–Perfusion Imaging in Pulmonary Embolism:
 461 Summary and Excerpts. J Nucl Med. 2017;58(5):13N–15N.
- 16. Stals MAM, Takada T, Kraaijpoel N, van Es N, Buller HR, Courtney DM, et al. Safety
- and Efficiency of Diagnostic Strategies for Ruling Out Pulmonary Embolism in
- 464 Clinically Relevant Patient Subgroups: A Systematic Review and Individual-Patient Data
- 465 Meta-analysis. Ann Intern Med. 2022;175(2):244–55. https://doi.org/10.7326/M21-2625.
- 466 17. Aromataris E, Munn Z, editors. JBI Manual for Evidence Synthesis. JBI; 2020.
- 18. Shamseer L, Moher D, Clarke M, Ghersi D, Liberati A, Petticrew M, et al. Preferred
 reporting items for systematic review and meta-analysis protocols (PRISMA-P) 2015:
 elaboration and explanation. BMJ. 2015;349:g7647. https://doi.org/10.1136/bmj.g7647.
- 470 19. McInnes MDF, Moher D, Thombs BD, McGrath TA, Bossuyt PM, Clifford T, et al.
- 471 Preferred Reporting Items for a Systematic Review and Meta-analysis of Diagnostic Test
 472 Accuracy Studies. JAMA. 2018;319(4):388–96.
- 473 https://doi.org/10.1001/jama.2017.19163.
- 474 20. Microsoft Corporation. Microsoft Excel [computer program]. Version 16.0.12527.22079.
 475 Microsoft Corporation; 2021.
- 476 21. Rayyan a web and mobile app for systematic reviews. Syst Rev. 2016;5(1):210.
 477 https://doi.org/10.1186/s13643-016-0384-4.
- 478 22. Whiting PF, Rutjes AWS, Westwood ME, Mallett S, Deeks JJ, Reitsma JB, et al.
- 479 QUADAS-2: a revised tool for the quality assessment of diagnostic accuracy studies.
- 480 Ann Intern Med. 2011;155:529–36. https://doi.org/10.7326/0003-4819-155-8481 201110180-00009.
- 482 23. Bossuyt PM, Reitsma JB, Bruns DE, Gatsonis CA, Glasziou PP, Irwig L, et al. STARD
 483 2015: an updated list of essential items for reporting diagnostic accuracy studies.
- 484 Radiology. 2015;277(3):617–28. https://doi.org/10.1148/radiol.2015151516.

- 485 24. Campbell M, McKenzie JE, Sowden A, Katikireddi SV, Brennan SE, Ellis S, et al.
- 486 Synthesis without meta-analysis (SWiM) in systematic reviews: reporting guideline.
- 487 BMJ. 2020;368:16890. https://doi.org/10.1136/bmj.16890.
- 25. Dinnes J, Deeks J, Kirby J, Roderick P. A methodological review of how heterogeneity
 has been examined in systematic reviews of diagnostic test accuracy. Health Technol
 Assess. 2005;9(12). https://doi.org/10.3310/hta9120.
- 491 26. Nyaga VN, Arbyn M. Metadta: a Stata command for meta-analysis and meta-regression
- 492 of diagnostic test accuracy data a tutorial. Arch Public Health. 2022;80(1).
- 493 https://doi.org/10.1186/s13690-021-00747-5.
- 494 27. Kontopantelis E, Reeves D. Performance of statistical methods for meta-analysis when
 495 true study effects are non-normally distributed: A simulation study. Stat Methods Med

```
496 Res. 2012;21(4):409–26. https://doi.org/10.1177/0962280210392008.
```

- 497 28. Fisher D, Harris R, Bradburn M, Deeks J, Harbord R, Altman D, et al. METAN: Stata
- 498 module for fixed and random effects meta-analysis. Stat Softw Components: Boston
 499 College Dept Econ; 2022.
- 29. Zahid A, Shahzad S, Ganaie M. Optimizing pre-imaging diagnosis of pulmonary
 embolism: A comparison of YEARS algorithm with original and simplified WELL'S
 scores. Chest. 2020;157:A396–A. https://doi.org/10.1016/j.chest.2020.05.444.
- 30. Abdelaal Ahmed Mahmoud M. Alkhatip A, Donnelly M, Snyman L, Conroy P, Hamza
 MK, Murphy I, et al. YEARS Algorithm Versus Wells Score: Predictive Accuracies in
 Pulmonary Embolism Based on the Gold Standard CT Pulmonary Angiography. Crit
 Care Med. 2020;48(5):704–8. https://doi.org/10.1097/CCM.00000000004271.
- 31. Kabrhel C, Van Hylckama Vlieg A, Muzikanski A, Singer A, Fermann GJ, Francis S, et
 al. Multicenter Evaluation of the YEARS Criteria in Emergency Department Patients
 Evaluated for Pulmonary Embolism. Acad Emerg Med. 2018;25(9):987–94.
- 510 https://doi.org/10.1111/acem.13417.
- 511 32. Eddy M, Robert-Ebadi H, Richardson L, Bellesini M, Verschuren F, Moumneh T, et al.
- 512 External validation of the YEARS diagnostic algorithm for suspected pulmonary
- 513 embolism. J Thromb Haemost. 2020;18(12):3289–95. https://doi.org/10.1111/jth.15083.
- 514 33. Nagel SN, Steffen IG, Schwartz S, Hamm B, Elgeti T. Age-dependent diagnostic
- 515 accuracy of clinical scoring systems and D-dimer levels in the diagnosis of pulmonary
- 516 embolism with computed tomography pulmonary angiography (CTPA). Eur Radiol.
- 517 2019;29(9):4563–71. https://doi.org/10.1007/s00330-019-06039-5.
- 518 34. Silva BV, Rigueira J, Aguiar Ricardo I, Mendonca C, Alves Da Silva P, Brito J, et al.
- 519 Best approach in d-dimer algorithm to exclude pulmonary thromboembolism: a

- 520 comparative study. Eur Heart J Cardiovasc Imaging. 2021;22(Supplement 1).
- 521 https://doi.org/10.1093/ehjci/jeaa356.250.
- 522 35. McLenachan CJ, Chua O, Chan BSH, Vecellio E, Chiew AL. Comparison of Wells and
- 523 YEARS clinical decision rules with D-dimer for low-risk pulmonary embolus patients.
- 524 Intern Med J. 2019;49(6):739–44. https://doi.org/10.1111/imj.14138.
- 525 36. García-Gómez LC, Castilla-Guerra L, de la Vega-Sánchez J, Olmo-Montes FJ,
- 526 Colmenero-Camacho MÁ. Usefulness of predictive models of pulmonary embolism. Med
- 527 Clin (Barc). 2020;154(9):338–43. https://doi.org/10.1016/j.medcli.2019.06.022.
- 528 37. Castro-Sandoval P, Barrois-Gonzalez R, Galindo-Martin MA, Ruiz-Grinspan MS,
- 529Rodriguez-Leal CM. Use of predictive scales for pulmonary thromboembolism in an
- 530 emergency department. Med Clin (Barc). 2022;159(10):483–5.
- 531 https://doi.org/10.1016/j.medcle.2022.03.017.
- 532 38. Stiell IG, Bennett C. Implementation of Clinical Decision Rules in the Emergency
- 533 Department. Acad Emerg Med. 2007;14(11):955–9. https://doi.org/10.1111/j.1553-
- 534 2712.2007.tb02372.x.
- 39. The Cochrane Collaboration. Review Manager [software]. Version 5.4. The Cochrane
 Collaboration; 2020.
- 40. Korevaar DA, Cohen JF, van Es J. YEARS Algorithm Versus Wells' Score: Incomplete
 Reporting Undermines Study Quality Assessment. Crit Care Med. 2020;48(8):e730.
 https://doi.org/10.1097/ccm.0000000004369.
- 540 41. Abdelaal Ahmed Mahmoud MAA, Conroy P, Khaled Hamza M, Purcell A, Murphy I,
- 541 Snyman L. The authors reply. Crit Care Med. 2020;48(12):e1378–e9.
- 542 https://doi.org/10.1097/ccm.00000000004701.
- 543 42. Tufanaru C, Munn Z, Stephenson M, Aromataris E. Fixed or random effects meta544 analysis? Common methodological issues in systematic reviews of effectiveness. Int J
 545 Evid Based Healthc. 2015;13(3):196–207.
- 546 https://doi.org/10.1097/XEB.00000000000065.
- 547 43. Carrier M, Righini M, Le Gal G. Symptomatic subsegmental pulmonary embolism: what
 548 is the next step? J Thromb Haemost. 2012;10(8):1486–90. https://doi.org/10.1111/j.1538549 7836.2012.04804.x.
- 44. Dobler CC. Overdiagnosis of pulmonary embolism: definition, causes and implications.
 Breathe. 2019;15(1):46–53. https://doi.org/10.1183/20734735.0339-2018.
- 45. Chan TM, Mercuri M, Turcotte M, Gardiner E, Sherbino J, de Wit K. Making Decisions
- in the Era of the Clinical Decision Rule: How Emergency Physicians Use Clinical

- 554 Decision Rules. Acad Med. 2020;95(8):1230–37.
- 555 https://doi.org/10.1097/ACM.00000000003098.
- 46. Lessler AL, Isserman JA, Agarwal R, Palevsky HI, Pines JM. Testing low-risk patients
 for suspected pulmonary embolism: a decision analysis. Ann Emerg Med.
- 558 2010;55(4):316–26.e1. https://doi.org/10.1016/j.annemergmed.2009.12.001.
- 559 47. Paez A. Gray literature: An important resource in systematic reviews. J Evid Based Med.
- 560 2017;10(3):233–40. https://doi.org/10.1111/jebm.12266.
- 48. Gerrish K, Lathlean J, editors. The Research Process in Nursing. 7th ed. Oxford, UK:
- 562 Wiley Blackwell; 2015.
- 563



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- 565 **Figure 1:** The YEARS Algorithm
- 566 Legend: DVT = Deep Vein Thrombosis. PE = Pulmonary Embolism. AI = Advanced
- 567 Imaging. Adapted from Van Der Hulle T, et al.⁹

Table 1: Data extracted from studies and results of crit	cal appraisal
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Other information	1 FN changed to TP (DVT only) AI ordered against protocol (N=40)	Included patients aged 16 years and older	Did not provide comparative data on AI utilisation between YEARS and reference test		Excluded all patients under the age of 50 years	AI ordered against protocol (N=386)	2 FN recalculated to TN (DVT only). 23 ISPE present (21 YEARS +ve and 2 YEARS -ve). Because of this 2 TN changed to 2 FN and 21 FP changed to TP	Statistical error noted p. 706, figure 1: CTPA +ve corrected from 96 to 76		
Female Cohort	62.2%	60.7%	51.2%	UNK	UNK	63.4%	56.9%	59.2%	55.8%	51%
Lost to follow up*	4	N/A	N/A	N/A	N/A	197	N/A	N/A	N/A	N/A
PE Incidence	12.3%	2.2%	25.6%	30.6%	28.9%	4.7%	22.7%	9.8%	20.8%	15.5%
Size	3465	2125	1000	409	353	1789	3314	794	544	200
Recruitment	12 hospitals	1 ED in	1 ED in Germany	1 ED in	1 hospital in	15 ED in	5 EDs in France,	1 hospital in	1 hospital in	1 ED in
location	in the	Australia		Portugal	England	the United	Switzerland and	Ireland	Spain	Spain
	Netherlands				(inpatient)	States	Belgium	(in/outpatient)	(inpatient)	
	(ED &									
	in/outpatient)									
Recruitment	Suspected PE	D-dimer	AI ordered for	AI ordered	AI ordered for	Suspected	AI ordered for	AI ordered for	AI ordered	AI ordered
strategy		ordered for	suspected PE	for	suspected PE	PE	suspected PE	suspected PE	for	for
		suspected PE		suspected PE					suspected PE	suspected PE
Methodology	Prospective	Retrospective	Retrospective	Retrospective	Retrospective	Prospective	Retrospective post-hoc	Retrospective	Retrospective	Retrospective
Study	Van Der	McLenachan ³⁵	Nagel ³³	Silva ³⁴	Zahid ²⁹	Kabrhel ³¹	Eddy ³²	Abdelaal ³⁰	Garcia-	Castro-
	Hulle ⁹								Gomez ³⁶	Sandoval ³⁷

A (7)

569 Legend: FN = False Negative. FP = False Positive. TN = True Negative. TP = True Positive. ED = Emergency Department. N/A = Non Applicable. UNK =

570 Unknown. *Lost to follow up without advanced imaging being performed

571 **Table 2:** Critical appraisal of included studies

	Van Der Hulle ⁹	McLenachan ³⁵	Nagel ³³	Silva ³⁴	Zahid ²⁹	Kabrhel ³¹	Eddy ³²	Abdelaal ³⁰	Garcia-Gomez ³⁶	Castro-Sandoval 37
1	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
2	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
3	Y	Y	Y	Y	N	Y	Y	Y	Y	Y
4	Y	Ν	Ν	Ν	Ν	Y	Ν	Y	Ν	N
5	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
6	Y	Ν	Y	Y	Y	Y	Y	Y	Y	Y
7	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
8	Y	Y	Y	Y	Y	Y	Y	Y	Y	Y
9	Ν	N	Y	Y	Y	N	N	Y	Y	Y
10	Y	Y	Y	Y	Y	N	Y	Y	Y	Y
Т	9	7	9	9	8	8	8	10	9	9

Legend: Y = Yes. N = No. U = Unclear. T = Total score out of 10

- 1. Was a consecutive or random sample of patients enrolled?
- 2. Was a case control design avoided?
- 3. Did the study avoid inappropriate exclusions?
- 4. Were the index test results interpreted without knowledge of the results of the reference standard?
- 5. If a threshold was used, was it pre-specified?
- 6. Is the reference standard likely to correctly classify the target condition?
- 7. Were the reference standard results interpreted without knowledge of the results of the index test?
- 8. Was there an appropriate interval between index test and reference standard?
- 9. Did all patients receive the same reference standard?
- 10. Were all patients included in the analysis?

5	7	2

	Study	TP	TN	FP	FN		Sensitivity (95% CI)			Specificity (95% CI)
-										
	Van Der Hulle, 2017	456	1642	1358	9		0.98 (0.96, 0.99)		•	0.55 (0.53, 0.57)
	McLenachan 2018	37	1747	332	9		0.80 (0.66, 0.91)		•	0.84 (0.82, 0.86)
	Nagel, 2019	250	566	178	6		0.98 (0.95, 0.99)		•	0.76 (0.73, 0.79)
	Silva, 2021	109	148	136	16	-	0.87 (0.80, 0.93)	-	•	0.52 (0.46, 0.58)
	Zahid, 2020	95	150	101	7	-	0.93 (0.86, 0.97)		~	0.60 (0.53, 0.66)
١	Kabrhel, 2018	78	1198	507	6	-	0.93 (0.85, 0.97)		•	0.70 (0.68, 0.72)
	Eddy, 2020	714	1408	1177	15		0.98 (0.97, 0.99)		•	0.54 (0.53, 0.56)
	Abdelaal, 2020	76	100	616	2	-	0.97 (0.91, 1.00)	•		0.14 (0.12, 0.17)
	Garcia-Gomez, 2020	111	59	372	2		0.98 (0.94, 1.00)	•		0.14 (0.11, 0.17)
	Castro-Sandoval, 2022	31	43	126	0		1.00 (0.89, 1.00)	-		0.25 (0.19, 0.33)
	Overall					Ó	0.96 (0.93, 0.98)	<	>	0.50 (0.33, 0.67)
					Г		1			
					0		1	0	1	
						Constituity		Snor	ificity	
						Sensitivity		Spec	monty	

573574 Figure 2: Forest plot of meta-analysis of sensitivity/specificity

Legend: FN = False Negative. FP = False Positive. TN = True Negative. TP = True

Positive.



579 Figure 3: Summary Receiver Operating Characteristics of meta-analysis of diagnostic test

accuracy



Figure 4: Meta-analysis of risk ratios of AI utilisation of YEARS compared to standard
 practice

Legend: D-WELLS = Dichotomised WELLS. AA D-WELLS = Age-Adjusted Dichotomised

586 WELLS. TT-WELLS = Three-Tier WELLS. AA TT-WELLS = Age-Adjusted Three-Tier
587 WELLS.