# Training methods in optical diagnosis and characterization of colorectal polyps: a systematic review and meta-analysis



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#### Authors

Samuel C.L. Smith<sup>1</sup>, Keith Siau<sup>\*, 2</sup>, Rosanna Cannatelli<sup>\*, 1,3</sup>, Giulio Antonelli<sup>\*, 4</sup>, Uday N. Shivaji<sup>1,5</sup>, Subrata Ghosh<sup>1,5</sup>, John R. Saltzman<sup>6</sup>, Cesare Hassan<sup>4</sup>, Marietta Iacucci<sup>1,5</sup>

#### Institutions

- 1 Institute of Translational Medicine and Institute of Immunology and Immunotherapy, University of Birmingham, United Kingdom
- 2 University Hospitals Birmingham NHS Trust, Birmingham, United Kingdom
- 3 Department of Gastroenterology, Spedali Civili and University of Milan, Italy
- 4 Endoscopy Unit, Nuovo Regina Margherita Hospital, Rome, Italy
- 5 National Institute for Health Research (NIHR) Birmingham Biomedical Research Centre, University Hospitals Birmingham NHS Trust, United Kingdom
- 6 Department of Gastroenterology, Brigham and Women Hospital, Harvard Medical School, Boston, Massachusetts, United States

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#### **Corresponding author**

Marietta lacucci, MD, PhD, FASGE, Reader/Senior Associate Professor of Gastroenterology, Institute of Translational Medicine, University of Birmingham, United Kingdom, Adjunct Clinical Associate Professor of Medicine, University of Calgary, Canada, Institute of Translational Medicine, Heritage iSBuilding for Research and Development, University Hospitals Birmingham NHS Foundation Trust, Edgbaston, Birmingham, UK, B15 2TT, United Kingdom Fax: +44 (0) 121 3718181 m.iacucci@bham.ac.uk Supplementary material is available under https://doi.org/10.1055/a-1381-7181

#### ABSTRACT

**Background and study aims** Correct optical diagnosis of colorectal polyps is crucial to implement a resect and discard strategy. Training methods have been proposed to reach recommended optical diagnosis thresholds. The aim of our study was to present a systematic review and meta-analysis on optical diagnosis training.

**Methods** PubMed/Medline and Cochrane databases were searched between 1980 and October 2019 for studies reporting outcomes on optical diagnosis training of colorectal polyps. The primary outcome was optical diagnosis accuracy compared to histological analysis pre-training and post-training intervention. Subgroup analyses of experienced/trainee endoscopists, training methods, and small/ diminutive polyps were included.

Results Overall, 16 studies met inclusion criteria, analyzing the impact of training on 179 endoscopists. Pre-training accuracy was 70.3% (6416/9131 correct diagnoses) whereas post-training accuracy was 81.6% (7416/9213 correct diagnoses) (risk ratio [RR] 1.17; 95% confidence interval [CI]: 1.09–1.24, P<0.001). In experienced endoscopists, accuracy improved from 69.8% (3771/5403 correct diagnoses) to 82.4% (4521/5485 correct diagnoses) (RR 1.20; 95% CI: 1.11–1.29, P<0.001). Among trainees, accuracy improved from 69.6% (2645/3803 correct diagnoses) to 78.8% (2995/3803 correct diagnoses) (RR 1.14; 95% CI 1.06–1.24, P<0.001). In the small/diminutive polyp subgroup, accuracy improved from 68.1% (3549/5214 correct diagnoses) to 77.1% (4022/5214 correct diagnoses) in (RR 1.16 95 % CI 1.08-1.24 P<0.001). On meta-regression analysis, the improvement in accuracy did not differ between computerized vs. didactic training approaches for experienced (P=0.792) and trainee endoscopists (P=0.312).

**Conclusions** Optical diagnosis training is effective in improving accuracy of histology prediction in colorectal polyps. Didactic and computer-based training show comparable effectiveness in improving diagnostic accuracy.

<sup>\*</sup> These authors contributed equally.

#### Introduction

Gastrointestinal endoscopy is integral to the diagnosis and management of colorectal polyps. Optical diagnosis using advanced endoscopic technologies such as high-definition, magnification and electronic virtual chromoendoscopy permit accurate prediction of histological characteristics of colorectal lesions based on endoscopic appearances and is increasingly utilized, and its implementation across the endoscopic community is on the rise [1].

Accurate optical diagnosis allows small/diminutive colorectal polyps (<10 mm) to be either spared or removed and discarded without the need for formal histological assessment: the "resect and discard" strategy [2]. The incorporation of optical diagnosis of small/diminutive polyps has been endorsed by The American Society of Gastrointestinal Endoscopy (ASGE) as well as recent European Society of Gastrointestinal Endoscopy (ESGE) guidelines [1]. If implemented there would be fewer specimens sent for histological analysis with substantial cost savings and reduced risk to patients with fewer unnecessary polypectomies [2,3].

In addition, optical characterization of colorectal polyps can accurately identify malignant areas within lesions and identify lesion borders, improving correct patient management. Sessile serrated lesions (SSL) are regarded as subtle lesions that can be easily missed; however optical diagnosis training through the use of polyp classification systems such as SIMPLE [4] and BASIC [5] may facilitate enhanced detection and characterization of SSL. Given the rise of artificial intelligence and its ability to improve detection of colorectal polyps, the technology can support polyp characterization provided endoscopists are skilled in optical diagnosis.

Training will be central to correctly implement optical diagnosis in clinical practice, as recognized in a recent evidencebased consensus [6]. Many different training strategies have been proposed and reported. Among them, traditional didactic training, computer-based self-learning and ad hoc training in vivo. This has become increasingly relevant following the coronavirus disease 2019 (COVID-19) pandemic, which has had an adverse impact on endoscopy training for trainees, particularly hands-on training, with a reduction in procedures of up to 96% [7]. Societies are now recommending trainees utilize alternative learning opportunities such as cognitive-based learning [8]. The aim of this systematic review and meta-analysis was to provide an overview of training in optical diagnosis of colorectal polyps and in view of the COVID-19 pandemic complete subgroup analysis of computer-based training.

#### Methods

Methodology of our analysis, inclusion criteria and reporting were in accordance with the Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) recommendations [9] and the Meta-analyses Of Observational Studies in Epidemiology (MOOSE) checklist [10]. This systematic review was registered in the International Prospective Register of Systematic Reviews (PROSPERO) with registration number CRD42020167486.

#### Search strategy

We performed an electronic database search of PUBMED/Medline, Cochrane and SCOPUS databases in addition to gray literature (scanning reference lists), to identify studies reporting training for the optical diagnosis of colorectal polyps between 1980 and October 2019. The search strategy is outlined below: Search strategy in PUBMED/Medline:

(Optical Diagnosis OR optical biopsy OR optical characterization) AND (colorectal polyp OR colorectal adenoma OR colorectal hyperplastic OR colorectal sessile serrated lesion OR colorectal sessile serrated adenoma), (Optical Diagnosis OR optical biopsy OR optical characterization) AND (colorectal polyp OR colorectal adenoma OR colorectal hyperplastic OR colorectal sessile serrated lesion OR colorectal sessile serrated adenoma) AND (training OR education), (Education OR Training) AND Colonoscopy AND (Colorectal polyp OR Colorectal adenoma OR Colorectal hyperplastic OR Colorectal sessile serrated lesion).

Search strategy in the other databases followed a similar but simplified strategy.

#### Inclusion and exclusion criteria

Studies were deemed eligible for inclusion according to the PICO statement (P, endoscopists undergoing assessment of optical diagnosis accuracy of small/diminutive colorectal polyps; I, endoscopists receiving optical diagnosis training; C, optical diagnosis as compared with histological result as gold standard; O, pre-training vs. post-training accuracy of optical diagnosis).

Studies not reporting pre-training vs. post-training performance and not published in English language were excluded. Randomized-controlled trials, observational and cohort studies and abstracts were all included for analysis.

#### Study selection

Titles and abstracts of all identified articles were independently screened by two authors (SS/RC) to exclude studies not related to the topic or not meeting inclusion criteria. Potentially relevant studies were screened for eligibility by analysis of the full text. Disagreements between the two authors were referred to and discussed with the senior author (MI) and resolved with consensus.

#### Data extraction and quality assessment

A standardized form was used to extract the data from each study. Data extracted included: a) Author name; b) Year of publication; c) Country; d) Training method (didactic, computerbased); e) Number of participants; f) Setting of study (in vivo/ ex vivo); g) Number and size of polyps; h) Number of correct histology predictions (accuracy); i) Training material; j) Endoscopic platform; and k) Duration of training.

The risk of bias of included studies was assessed using the Cochrane Collaboration's tool [11]. Each study was assessed for risk of bias through study design in selection bias (random sequence generation and methods to conceal allocation), performance bias (blinding of participants), detection bias (blinding of outcomes), attrition bias (completeness of outcome data) and reporting bias (selective reporting). The overall quality of evidence was summarized using The Grading of Recommendations Assessment, Development and Evaluation (GRADE) approach, categorizing the evidence as very low, low, moderate or high-quality.

#### Study definitions

A small/diminutive colorectal polyp was defined as  $\leq 10 \text{ mm}$  in size. Optical diagnosis training was defined as an intervention designed to educate participants on optical diagnosis methodology. Experienced endoscopists were participants who are independent endoscopists who have completed endoscopy training but who are not considered experts. Trainee endoscopists were defined as participants who are practicing within a designated gastroenterology training program.

#### Study outcomes

The primary outcome of our systematic review and meta-analysis was optical diagnosis accuracy compared with histological analysis before and after training intervention. We aimed to complete subgroup analysis by endoscopists experience (experienced, trainee endoscopists), training method (didactic, computer-based) and polyp size (small/diminutive polyps).

#### Statistical analysis

A random effect meta-analysis was performed to investigate the effect of training on the accuracy of optical diagnosis. For each study, accuracy was compared between post-training and pre-training stages and expressed as a risk ratio (RR) with 95% confidence interval (CI), wwhich were pooled using a random-effects Mantel-Haenszel model. Forest plots were generated for all studies, followed by level of experience (trainee vs experienced endoscopists), and then for the subgroups of didactic vs. computer-based training. We also calculated 95% Cls to determine the variation in effect between studies [12, 13]. Statistical heterogeneity was assessed using l<sup>2</sup> statistics, with a value of 0% to 40% accepted as not important, 30% to 60% as moderate, >60% as substantial and >90% as considerable heterogeneity [11].

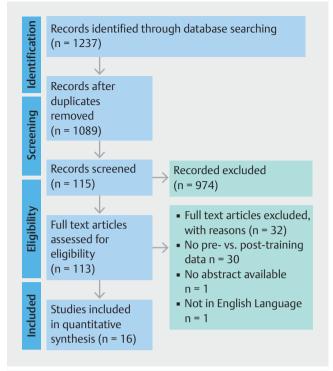
Publication bias was assessed by observing asymmetry in funnel plots and sensitivity analyses performed by excluding outliers and then by year of publication.

Meta-analyses were performed using RevMan v5.3 (Cochrane Collaboration, Copenhagen: The Nordic Cochrane Centre, The Cochrane Collaboration, 2014) and pooled effects of didactic and computer-based training subjected to a randomeffects meta-regression model using Open Meta-Analyst (Brown University). *P*<0.05 was considered statistically significant.

#### Results

#### Study selection and characteristics

The PRISMA [9] and MOOSE [10] checklist (**Appendix 1**) and flow chart (**> Fig. 1**) were followed to ensure compliance. The literature search yielded 1237 results. After preliminary screen-



▶ Fig. 1 PRISMA flowchart. From: Moher D, Liberati A, Tetzlaff J, Altman DG, The PRISMA Group (2009). Preferred Reporting Items for Systematic Reviews and Meta-Analyses: The PRISMA Statement. PLoS Med 6(7): e1000097. doi:10.1371/journal.pmed 1000097

ing of titles and abstracts, 113 were selected for full text review. Of these, 16 papers [4, 14-28] (before 2010 n=1, 2010-2015 n = 7, 2016–2019 n = 8) matched the selection criteria and were included in the systematic review. Of these studies, seven were from Europe [4, 17, 21, 23, 26–28], six from North America [14, 16, 18-20], 24] and three from Asia [15, 22, 25]. Among included studies, eight reported on didactic training [4, 14–16, 18, 22, 23, 27], seven on computer-based self-training [17, 19– 21,24–26] and one on computer-based self-training vs. didactic training [28]. The majority of studies were observational in design (n = 14) and there were two randomized trials [18, 28]. Overall 11 studies were based on NBI system [14-22, 24, 25], one on iScan [26] and one on BLI (Blue Light Imaging) [27], two on NBI and iScan [4,28] and one on high-definition white light (HDWL)/chromoendoscopy [23]. Sixteen studies reported pre-training and post-training values, two studies included trainees [4,28], eight included fully qualified/BCSP (Bowel Cancer Screening Programme) endoscopists [14, 15, 18-22, 25] and six studies included both groups [16, 17, 23, 24, 26, 27]. There were nine studies that only included small/diminutive colorectal polyps [4, 15, 17, 19, 20, 25-28]. Study characteristics are presented in > Table 1.

Author, year	Study design	Type of training	Type of partici- pant	Number of parti- cipants	Training duration	Training material	Platform	Number of polyps post- training
Rogart, 2008	Prospective, observational	Didactic	Experi- enced	4	1 hour	Ex vivo, Im- age?	NBI	20 (still images)
Higashi, 2010	Prospective, observational	Didactic	Experi- enced	4	1 hour	Ex vivo, im- age-based	NBI	44 (still images)
Raghaven- dra, 2010	Prospective, observational	Didactic	Experi- enced and trainee	25	20 minutes	Ex vivo, im- age-based	NBI	25 (still images)
lgnjatovic, 2011	Prospective, observational	Comput- er-based	Experi- enced and trainee	14	15 minutes	Ex vivo, im- age-based	NBI	30 (still images)
Coe, 2012	Randomized- controlled trial	Didactic	Experi- enced	15	2x 1-hour sessions	Ex vivo, images and videos	NBI	774 in total (in vivo)
Rastogi, 2014	Prospective, observational	Comput- er-based	Experi- enced	10	20 minutes	Ex vivo, images	NBI	40 (video format
Sinh, 2015	Prospective, observational	Comput- er-based	Experi- enced	15	20 minutes	Ex vivo, im- age-based	NBI	40 (video format
lJspeert, 2016	Prospective, observational	Comput- er-based	Experi- enced	10	20 minutes	Ex vivo, images	NBI	45 (still images)
Sikong, 2016	Prospective, observational	Didactic	Experi- enced	10	3×1-hour sessions over 3 months	Ex vivo, im- age-based	NBI	130 (still images)
Basford, 2017	Prospective, observational	Didactic	Experi- enced and trainee	10	30 minutes	Ex vivo, im- age-based	HD WLE and chro- moendo- scopy	37 (still images)
Aihara, 2018	Prospective, observational	Comput- er-based	Experi- enced and trainee	8	10 minutes	Ex vivo, im- age-based	NBI	50 (still images)
lacucci, 2018	Prospective, observational	Didactic	Trainee	6	1 hour	Ex vivo, images and videos	iScan OE and NBI	80 (videos)
Bae, 2019	Prospective, observational	Comput- er-based	Experi- enced	15	30 minutes, weekly feed- back and in- terim inter- active train- ing	Ex vivo, im- age-based	NBI	80 (still images)
Basford, 2019	Prospective, observational	Comput- er-based	Experi- enced and trainees	14	20 minutes	Ex vivo, im- age-based	iScan and chromo- endos- copy	30 (still images)
Subrama- niam, 2019	Prospective, observational	Didactic	Experi- enced and trainees	10	4 hours	Ex vivo, im- age-based	BLI	45 (still images)
Smith, 2019	Randomized- controlled trial	Comput- er-based and di- dactic	Trainees	16	1 hour	Ex vivo, images and videos	iScan OE and NBI	78 (videos)

► Table 1 Studies assessed.

NBI, narrow-band imaging; HD, high definition; WLE, white light endoscopy; BLI, blue light imaging; OE, optical enhancement.

Study or Subgroup	Post Events	Total	Pre Events	Total	Weight	Risk Ratio M-H, Random, 95 % Cl	Year	Risk Ratio M-H, Random, 95 % Cl
Rogart 2008	76	80	72	80	6.1%	1.06 [0.97, 1.15]	2008	1
Higashi 2010	137	176	114	176	5.3%	1.20 [1.05, 1.37]	2010	· · · · · · · · · · · · · · · · · · ·
Raghevendra 2010	577	625	328	625	6.3%	1.76 [1.63, 1.90]	2010	
gnjatovic 2011	364	420	300	420	6.4%	1.21 [1.13,1.30]	2011	
Coe 2012	554	774	521	692	6.5%	0.95 [0.89, 1.01]	2012	!
Rastogi 2014	322	400	256	400	6.1%	1.26 [1.15, 1.37]	2014	
Sinh 2015	516	600	384	600	6.4%	1.34 [1.26, 1.44]	2015	
jspeert 2016	392	450	329	450	6.4%	1.19 [1.11, 1.27]	2016	
Sikong 2016	1261	1300	1034	1300	6.8%	1.22 [1.18, 1.26]	2016	-
Basford 2017	266	370	239	370	5.9%	1.11 [1.01, 1.23]	2017	· · · · · · · · · · · · · · · · · · ·
Aihara 2018	368	400	344	400	6.6%	1.07 [1.02, 1.12]	2018	
acucci 2018	204	300	171	300	5.4%	1.19 [1.05, 1.35]	2018	
3ae 2019	938	1200	844	1200	6.7%	1.11 [1.06, 1.17]	2019	
Basford 2019	299	420	269	420	6.0%	1.11 [1.01, 1.22]	2019	
Subramaniam 2019	399	450	381	450	6.6%	1.05 [0.99, 1.10]	2019	
Smith 2019	843	1248	830	1248	6.6%	1.02 [0.96, 1.07]	2019	
otal (95 % CI)		9213		9131	100.0%	1.17 [1.09, 1.24]		•
Total events	7516		6416					
Heterogeneity: Tau <sup>2</sup>	= 0.02;	Chi <sup>2</sup> = 2	242.07,	df = 18	(P < 0.00	001); l <sup>2</sup> = 94%		0.5 0.7 1 1.5
Test for overall effect								Pre-Training Post-Training

Fig.2 Forest plots for all studies assessing the effect of training on accuracy of optical diagnosis of colorectal polyps.

## Overall training efficacy and overall efficacy of training methods

When pooling together all studies, polyp sizes (16 studies, 179 participants) [4, 14–27], assessing the efficacy of any method of optical diagnosis training, pooled pre-training accuracy was 70.3% (6416/9131 correct diagnoses) vs. post-training accuracy was 81.6% (7416/9213 correct diagnoses) (RR 1.17 95% CI 1.09–1.24 *P*<0.001) (**Fig.2**). The 95% prediction interval was 0.85–1.61. There was considerable heterogeneity in these studies ( $I^2 = 94\%$ ) without significant publication bias (**Supplementary Fig. 1**a).

When pooling only studies describing computer-based training (8 studies, 94 participants) [17, 19–21, 24–26, 28], pooled pre-training accuracy was 69.2% (3125/4514 correct diagnoses) vs. post-training accuracy of 80.0% (3611/4514 correct diagnoses) (RR 1.16 95% CI 1.09–1.23 *P*<0.001) (**>** Fig. **3a**). The 95% prediction interval was 0.92–1.46. We detected substantial heterogeneity in this subgroup (I<sup>2</sup> 84%) without significant publication bias.

When pooling only studies describing didactic training (nine studies, 85 participants) [4, 14–16, 18, 22, 27, 28], pooled pretraining accuracy was 71.3% (3291/4617 correct diagnoses) vs. post-training accuracy of 83.1% (3905/7516 correct diagnoses) (RR 1.15 95% CI 1.03–1.29 P<0.001) (**>** Fig. 3b). The 95% prediction interval was 0.77–1.71. We detected considerable heterogeneity in this subgroup (l<sup>2</sup> 96%) without significant publication bias (**Supplementary Fig. 1b**). On meta-regression analysis, there was no significant difference in post-training accuracy between didactic and computerbased delivery methods (P=0.798).

#### Experienced endoscopists

We subsequently selected only studies describing the efficacy of training in experienced endoscopists. Method of training for experienced endoscopists comprised of didactic training (seven studies, 49 participants) [14–16, 18, 22, 23, 27] and computer-based training (six studies, 64 participants) [17, 19–21, 25, 26].

After pooling these studies, optical diagnosis training method on optical diagnosis in experienced endoscopists improved accuracy from 69.8% (3771/5403 correct diagnoses) to 82.4% (4521/5485 correct diagnosis) (RR 1.20 95% CI 1.11–1.29 P< 0.001). The 95% prediction interval was 0.87–1.65 and heterogeneity was considerable (I<sup>2</sup> 92%).

On subgroup analysis by type of training, didactic training improved optical diagnosis accuracy from 72.2% (1685/2333 correct diagnoses) to 83.9% (2027/2415 correct diagnoses) RR 1.19 (95% CI 1.03–1.36 P<0.001), and computer-based training from 67.9% (2086/3070 correct diagnoses) to 81.2% (2494/3070 correct diagnoses) RR 1.21 (95% CI 1.13–1.30 P<0.001). The improvement was not significantly different between the two training methods (P=0.792) ( $\triangleright$  Fig.4a).

Study or Subgroup	Post Events	Total	Pre Events	Total	Weight	Risk Ratio M-H, Random, 95 % Cl	Year	Risk Ratio M-H, Random, 95% Cl
1.1.1 Computer								
Ignjatovic 2011	364	420	300	420	6.0%	1.21 [1.13,1.30]	2011	
Rastogi 2014	322	400	256	400	5.8%	1.26 [1.15, 1.37]	2014	
Sinh 2015	516	600	384	600	6.0%	1.34 [1.26, 1.44]	2015	
ljspeert 2016	392	450	329	450	6.1%	1.19 [1.11, 1.27]	2016	
Aihara 2018	368	400	344	400	6.3%	1.07 [1.02, 1.12]	2018	
Bae 2019	938	1200	844	1200	6.3%	1.11 [1.06, 1.17]	2019	
Basford 2019	299	420	269	420	5.7%	1.11 [1.01, 1.22]	2019	
Smith (C) 2019	412	624	399	624	5.9%	1.03 [0.95, 1.12]	2019	
Subtotal (95 % CI)		4514		4514	47.9%	1.16 [1.09, 1.23]		•
Total events	3611		3125					·
Heterogeneity: Tau <sup>2</sup>	$^{2} = 0.01;$	Chi <sup>2</sup> = 4	45.14, d	f = 7 (P	< 0.0000	1); I <sup>2</sup> = 84%		
Test for overall effec	t: Z = 4.8	88 (P <	0.00001	)				
а								
1.1.2 Didactic								
Rogart 2008	76	80	72	80	5.7%	1.06 [0.97, 1.15]	2008	
Higashi 2010	137	176	114	176	5.0%	1.20 [1.05, 1.37]		
Raghevendra 2010	577	625	328	625	5.9%	1.76 [1.63, 1.90]	2010	
Coe 2012	554	774	521	692	6.1%	0.95 [0.89, 1.01]	2012	
Sikong 2016	1261	1300	1034	1300	6.4%	1.22 [1.18, 1.26]	2016	
Basford 2017	266	370	239	370	5.6%	1.11 [1.01, 1.23]		
lacucci 2018	204	300	171	300	5.1%	1.19 [1.05, 1.35]		i —
Subramaniam 2019	399	450	381	450	6.2%	1.05 [0.99, 1.10]		
Smith (D) 2019	431	624	431	624	6.0%	1.00 [0.93, 1.08]	2019	
Subtotal (95 % Cl)		4699		4617	52.1%	1.15 [1.03, 1.29]		-
Total events	3905		3291					
Heterogeneity: Tau <sup>2</sup>				df = 8 (	<i>P</i> < 0.000	01); $I^2 = 96\%$		
Test for overall effec <b>b</b>	t: Z = 2.	50 (P =	0.01)					
Total (95 % CI)		9213		9131	100.0%	1.16 [1.09, 1.23]		•
Total events	7516		6416					
Heterogeneity: Tau <sup>2</sup>	<sup>2</sup> = 0.02;	Chi <sup>2</sup> = 2	242.86,	df = 16	(P < 0.00)	001); I <sup>2</sup> = 93 %		
Test for overall effec		•		,				0.5 0.7 1 1.5
Test for subgroup di	ifference	s: Chi <sup>2</sup>	= 0.02. 0	df = 1(	P = 0.89),	$ ^2 = 0\%$		Pre-Training Post-Training

**Fig. 3** Forest plots for studies assessing the effect of **A** computer-based and **B** didactic training on accuracy of optical diagnosis of colorectal polyps.

#### Trainee endoscopists

A total of eight studies [4, 16, 17, 23, 24, 26–28] evaluated impact of training among in 58 trainee endoscopists. In detail, four studies [4, 16, 23, 27] with 28 participants used didactic training, and three studies [17, 24, 26] with 22 participants evaluated computer-based training. Only one study compared didactic vs computer-based training [28].

After aggregating these studies involving trainee participants, optical diagnosis training improved accuracy from 69.6% (2645/3803 correct diagnoses) to 78.8% (2995/3803 correct diagnoses) (RR 1.14; 95% CI 1.06–1.24, *P*<0.001). The

95% prediction interval was 0.90–1.44. Once again, we detected considerable heterogeneity ( $I^2$  89%). On subgroup analysis didactic training improved accuracy from 68.1% (1606/2359 correct diagnoses) to 79.6% (1878/2359 correct diagnoses) (RR 1.18; 95% CI 1.04–1.34, *P*<0.001) and computer-based training from 72.0% (1039/1444 correct diagnoses) to 77.4% (1117/1444 correct diagnoses) (RR 1.09; 95% CI 1.03–1.15, *P*<0.001) (**> Fig. 4b**). The improvement in accuracy did not differ significantly between the two training methods (*P*= 0.312).

Study or Subgroup	Post Events	Total	Pre Events	Total	Weight	Risk Ratio M-H, Random, 95 % Cl	Year	Risk Ratio M-H, Random, 95% Cl
1.3.1 Didactic						95 % CI		i
Rogart 2008	76	80	72	80	7.8%	1.06 [0.97, 1.15]	2000	
Higashi 2010	137	176	114	176	6.8%	1.20 [1.05, 1.37]		
Raghevendra 2010	295	325	148	325	0.8 % 7.1 %	1.99 [1.76, 2.26]		
Coe 2012	554	774	521	692	8.2%	0.95 [0.89, 1.01]		
Sikong 2016	627	650	517	650	8.5%	1.21 [1.16, 1.26]		
Basford 2017	135	185	126	185	6.9%	1.07 [0.94, 1.22]		
Subramaniam 2019	203	225	187	225	8.1%	1.09 [1.01, 1.17]		
Subtotal (95 % CI)		2415		2333	53.3%	1.19 [1.03, 1.36]		
Total events	2027		1685					
Heterogeneity: Tau <sup>2</sup>	= 0.03;	Chi <sup>2</sup> =	127.68,	df = 6 (	P < 0.000	01); I <sup>2</sup> = 95%		
Test for overall effect				,				
			,					
1.3.2 Computer								
Ignjatovic 2011	176	210	142	210	7.3%	1.24 [1.11, 1.38]	2011	
Rastogi 2014	322	400	256	400	7.8%	1.26 [1.15, 1.37]	2014	
Sinh 2015	516	600	384	600	8.1%	1.34 [1.26, 1.44]	2015	
lispeert 2016	392	450	329	450	8.2%	1.19 [1.11, 1.27]	2016	
Basford 2019	150	210	131	210	6.8%	1.15 [1.00, 1.31]		
Bae 2019	938	1200	844	1200	8.4%	1.11 [1.06, 1.17]		-
Subtotal (95 % CI)		3070		3070	46.7%	1.21 [1.13, 1.30]		•
Total events	2494		2086					
Heterogeneity: Tau <sup>2</sup>	= 0.01;	Chi <sup>2</sup> = 2	22.51, d	f = 5 (P	< 0.0004	); I <sup>2</sup> = 78 %		
Test for overall effec						,.		
Total (95 % CI)		5485		5403	100.0%	1.20 [1.11, 1.29]		•
Total events	4521		3771					
Heterogeneity: Tau <sup>2</sup>					(P < 0.00	001); $I^2 = 92\%$		0.5 0.7 1 1.5 2
Test for overall effect		•		,				Pre-Training Post-Training
Test for subgroup di	fference	s: Chi <sup>2</sup>	= 0.08, a	df = 1 (	P = 0.77),	$ ^2 = 0\%$		

**Fig.4a** Forest plots for studies assessing the impact of training on the accuracy optical diagnosis of colorectal polyps in experienced endoscopists.

#### Small/diminutive colorectal polyps

We selected studies that only included small/diminutive colorectal polyps in the assessment of training in optical diagnosis. A total of nine studies assessed the impact of optical diagnosis training on 104 endoscopists [4, 15, 17, 19, 20, 25–28]. The pooled pre-training accuracy was 68.1% (3549/5214) and post-training accuracy was 77.1% (4022/5214) (RR 1.16 95% CI 1.08–1.24 *P*<0.001) (**Supplementary Fig.2**). We detected substantial heterogeneity in these studies (I<sup>2</sup> 87%).

#### Study quality and risk of bias

The summary of the Cochrane Collaboration's risk of bias tool is presented in  $\triangleright$  Fig. 5. Only two randomized trials were included [18, 28], both of which report how the randomization process took place but both were unable to conceal the allocation to participants. Participants in all studies included were not blinded to the intervention. Participants were blinded to the out-

comes of training during the study process for most studies and all studies produced complete datasets without selective reporting.

Using the GRADE approach, the quality of evidence was downgraded by two points to low quality due to risk of bias and inconsistency from the heterogeneity in the studies.

#### Discussion

According to our systematic review and meta-analysis, training in the optical diagnosis of colorectal polyps was associated with improved diagnostic accuracy in both experienced and trainee endoscopists. Furthermore, when only considering small/diminutive colorectal polyps there was also a statistically significant improvement in diagnostic accuracy following training. These results are clinically relevant and important for the following considerations. First, the efficacy of training has been

Study or Subgroup	Post Events	Total	Pre Events	Total	Weight	Risk Ratio M-H, Random, 95 % Cl	Year	Risk Ratio M-H, Random, 95% CI
1.2.1 Didactic								
Raghevendra 2010	282	300	180	300	10.0%	1.57 [1.42, 1.73]	2010	
Sikong 2016	634	650	517	650	11.5%	1.23 [1.18, 1.28]	2016	-
Basford 2017	131	185	113	185	8.3%	1.16 [1.00, 1.34]	2017	
lacucci 2018	204	300	171	300	9.1%	1.19 [1.05, 1.35]	2018	
Subramaniam 2019	196	300	194	300	9.4%	1.01 [0.90, 1.14]	2019	
Smith 2019	431	624	431	624	10.7%	1.00 [0.93, 1.08]	2019	
Subtotal (95 % CI)		2359		2359	<b>59.0</b> %	1.18 [1.04, 1.34]		-
Total events	1878		1606					
Heterogeneity: Tau <sup>2</sup>	= 0.02;	Chi <sup>2</sup> =	63.46, d	f = 5 (P	< 0.0000	1); I <sup>2</sup> = 92 %		
Test for overall effec	:t: Z = 2.5	55 (P =	0.01)					
1.2.2 Computer								
Ignjatovic 2011	188	210	158	210	10.2%	1.19 [1.09, 1.30]	2011	
Aihara 2018	368	400	344	400	11.3%	1.07 [1.02, 1.12]		-
Smith 2019	412	624	399	624	10.5%	1.03 [0.95, 1.12]		i
Basford 2019	149	210	138	210	8.9%	1.08 [0.95, 1.23]		
Subtotal (95 % CI)		1444		1444	41.0%	1.09 [1.03, 1.15]		•
Total events	1117		1039					
Heterogeneity: Tau <sup>2</sup>	= 0.00;	Chi <sup>2</sup> = !	5.83, df	= 3 (P <	< 0.12); l <sup>2</sup>	= 49%		
Test for overall effec	:t: Z = 2.8	89 (P <	0.004)					
Total (95 % CI)		3803		3803	100.0%	1.14 [1.06, 1.24]		•
Total events	2995		2645					-
TOLALEVENUS				r 0 / P		12 24 200		i i
	= 0.01:	Chi <sup>2</sup> = 3	84.83. d	t = 9 (P	< 0.0251:	$1^2 = 24.2\%$		
Heterogeneity: Tau <sup>2</sup> Test for overall effec				•	< 0.025);	12 = 24.2%		0.5 0.7 1 1.5

Fig.4b Forest plots for studies assessing the impact of training on the accuracy optical diagnosis of colorectal polyps in trainees.

proved for both experienced and trainees in endoscopy. Indeed, trainees showed a similar post-training accuracy level as compared to experienced endoscopists, confirming the positive impact of training on optical diagnosis. Second, irrespective of the pre-training accuracy level, training programs resulted in uniformly elevated accuracy levels. Third, there was no statistically significant difference seen in the improvement in accuracy between computer-based and didactic training.

Endoscopy practice is going through major changes, which have accelerated in response to the COVID-19 pandemic. To minimize the risk of exposure to COVID-19, units are taking steps to lessen the footfall in procedural rooms, [29]. This will inevitably have a serious consequence on endoscopy training, particularly given that restrictions may be in place until 2022 [30,31]. It is recognized that during these unprecedented times that trainees seek training in alternative means, perhaps focusing on cognitive skills [30]. This increased importance in alternative educational resources such as computer-based and simulation based training in optical diagnosis would address the unmet need during this period and likely in the longer term too [7]. Our study confirms that computer-based training is effective in improving optical diagnosis accuracy and furthermore, there is no statistical difference between computer-based and didactic training which is further confirmed by a randomized trial [28]. Although the *P* values and lower bound 95% CIs of our analyses indicate a statistically significant beneficial effect of training, the 95% prediction intervals suggest that, while the "average" training course is likely to result in an improvement in predictive accuracy after optical diagnosis training, there are likely to be courses where no benefit is observed. This is also reflected in the  $l^2$  values which indicate considerable heterogeneity in most analyses. As such there needs to be a focus on the validation, standardization and quality assurance of training and long-term studies to assess the retention of optical diagnosis skills after a training intervention.

Most studies investigating the effectiveness of training methods on the optical diagnosis of colorectal polyps were small observational studies with only two randomized trials. The studies included a baseline level of performance prior to training enabling us to fully ascertain the effectiveness of training. Including trainee and experienced endoscopists, the target

Key Low risk of bias High risk of bias Unclear risk of bias	Random sequence generation	Conceal allocation	Blinding of participants	Blinding of oucomes	Completeness of data	Selective reporting
Aihara, 2018				0	0	0
Bae 2019				?	0	•
Basford 2017				•	•	•
Basford 2019				•	0	•
Coe 2012	0	•	•	0	0	0
Higashi 2010		•	•	•	0	0
lacucci 2018	•	•	•	0	0	0
Ignatovic 2011	•	•	•	0	0	0
ljspeert 2016	0	0	0	0	0	0
Raghevendra 2010	•	0	0	0	0	0
Rastogi 2014	0	0	0	•	0	0
Rogart 2008		0	•	?	0	0
Sikong 2016		•	0	?	0	0
Sinh 2015	•	•	0	•	0	0
Smith 2019	0	•	•	•	0	0
Sudramaniam 2019	•	0	0	Ð	0	•

▶ Fig. 5 Risk of bias of studies included using Cochrane Collaboration's risk of bias tool

of intervention was relevant to the clinical practice of endoscopy. The substantial heterogeneity of studies may be explained by the following differences: training intervention (number of sessions and duration), assessment methods (type of media used, endoscopic platform and whether material was repeated pre- and post-training), type of lesions included (some studies only included hyperplastic and adenomas [16, 17,27]), washout period between pre-training assessment and training, and participant characteristics (pre-training accuracy levels were as low as 45% in one study among experienced endoscopists [16] and as high as 88% in some trainees [27]).

The systematic review and meta-analysis has limitations. First, all included studies were unblinded due to the nature of the intervention (i.e. training methods). This however is a common bias of many evaluation of technological improvements in gastrointestinal endoscopy. Second, participants were aware that their performance in assessments were being monitored and analyzed, which may introduce further bias as there may have been a subconscious increased effort during the study period. One possible solution to this would be tracking in vivo optical diagnosis accuracy for a prolonged period of time before and after training. However, this would be resource intensive and may still incur bias. Third, not all studies provided data to calculate sensitivity, specificity or negative predictive values (against the recommended ASGE PIVI threshold of >90%), nor was it possible to compare receiver operating characteristics curves pre-training and post-training. Given the large degree of heterogeneity, the inconsistency of results, the lack of randomized controlled trials and inherent bias the guality of evidence of the studies is considered to be low.

This systematic review and meta-analysis has uncovered important gaps in evidence, which will need to be addressed in future studies. Further study on optical diagnosis training is required to establish the optimum method. There is a lack of robust randomized trials comparing training modes with only one comparing didactic with computer-based training [28]. Another important consideration is the effectiveness of training across endoscopic platforms, while initial attempts at this suggest that training is effective across NBI and iScan [4, 28], however there is yet to be a study that includes all of NBI, iScan and BLI. The issue of retention of optical diagnosis over time is one that has yet to be thoroughly explored. The majority of studies included in this systematic review and meta-analysis involve participants scoring media on the same day as training, however none have demonstrated that optical diagnosis skills can be retained over a prolonged period of time. This is essential for optical diagnosis to be incorporated in everyday practice. Future studies should reassess participants after a prolonged period of time such as 3 to 6 months or even longer and should include an in vivo assessment component to formally investigate whether ex vivo training can translate to in vivo performance over time.

A future training strategy may include a combination of methods with perhaps didactic training from experts to set a foundation of knowledge, further supported by computerbased training or artificial intelligence (AI) systems. Computerbased training could be periodically reinforced relatively easily. The ESGE suggest the most likely scenario will be as a "second reader" as opposed to a "stand alone" system [32]. Therefore, for AI to be utilized in everyday practice there is a need for endoscopists to up skill in optical diagnosis to be able to safely interpret and act upon the readings from AI systems.

#### Conclusions

In conclusion, training in optical diagnosis improves the accuracy of histology predictions of colorectal polyps, including small/ diminutive polyps. The optimal method of training may include a combination of training methods augmented with continuous in vivo training, which may be provided by trainers or AI systems. Future studies need to focus on standardizing and validating training modules to enhance cognitive skills of endoscopists.

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#### **Competing interests**

The authors declare that they have no conflict of interest.

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