REVIEW

Quantitative MR imaging biomarkers for distinguishing infammatory pancreatic mass and pancreatic cancer—a systematic review and meta-analysis

Zi-he Wang^{1†}, Liang Zhu^{2*†}, Hua-dan Xue^{2*} and Zheng-yu Jin²

Abstract

Objectives To evaluate the diagnostic performance of quantitative magnetic resonance (MR) imaging biomarkers in distinguishing between infammatory pancreatic masses (IPM) and pancreatic cancer (PC).

Methods A literature search was conducted using PubMed, Embase, the Cochrane Library, and Web of Science through August 2023. Quality Assessment of Diagnostic Accuracy Studies 2 (QUADAS-2) was used to evaluate the risk of bias and applicability of the studies. The pooled sensitivity, specifcity, positive likelihood ratio, negative likelihood ratio, and diagnostic odds ratio were calculated using the DerSimonian-Laird method. Univariate meta-regression analysis was used to identify the potential factors of heterogeneity.

Results Twenty-four studies were included in this meta-analysis. The two main types of IPM, mass-forming pancrea‑ titis (MFP) and autoimmune pancreatitis (AIP), differ in their apparent diffusion coefficient (ADC) values. Compared with PC, the ADC value was higher in MFP but lower in AIP. The pooled sensitivity/specifcity of ADC were 0.80/0.85 for distinguishing MFP from PC and 0.82/0.84 for distinguishing AIP from PC. The pooled sensitivity/specifcity for the maximal diameter of the upstream main pancreatic duct (dMPD) was 0.86/0.74, with a cutoff of dMPD ≤ 4 mm, and 0.97/0.52, with a cutoff of dMPD ≤ 5 mm. The pooled sensitivity/specificity for perfusion fraction (*f*) was 0.82/0.68, and 0.82/0.77 for mass stifness values.

Conclusions Quantitative MR imaging biomarkers are useful in distinguishing between IPM and PC. ADC values dif‑ fer between MFP and AIP, and they should be separated for consideration in future studies.

Clinical relevance statement Quantitative MR parameters could serve as non-invasive imaging biomarkers for dif‑ ferentiating malignant pancreatic neoplasms from infammatory masses of the pancreas, and hence help to avoid unnecessary surgery.

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- *Several quantitative MR imaging biomarkers performed well in diferential diagnosis between infammatory pancreatic mass and pancreatic cancer.*
- *The ADC value could discern pancreatic cancer from mass-forming pancreatitis or autoimmune pancreatitis, if the two infammatory mass types are not combined.*
- *The diameter of main pancreatic duct had the highest specifcity for diferentiating autoimmune pancreatitis from pancre atic cancer.*

Keywords Pancreatic neoplasms, Pancreatitis (chronic), Diagnosis (diferential), Meta-analysis

Introduction

Infammatory pancreatic masses (IPM) primarily encompass mass-forming pancreatitis (MFP) and autoimmune pancreatitis (AIP). The imaging appearance of both tumors mimics pancreatic cancer (PC) [[1,](#page-11-0) [2\]](#page-11-1). However, PC is a highly fatal disease and carries an extremely poor prognosis with the lowest 5-year relative survival rate among all cancers [[3](#page-11-2)]. Surgical resection remains the only curative method available. In contrast, surgery is not the optimal treatment option for patients with IPM. Given that postoperative morbidity rates remain high, it is essential to accurately diferentiate between IPM and PC to avoid unnecessary surgery [\[4\]](#page-11-3). Magnetic resonance (MR) imaging has the advantages of no radiation exposure and high soft tissue contrast. Quantitative MR parameters can serve as non-invasive imaging biomarkers to distinguish between malignant pancreatic neoplasms from infammatory masses.

Several quantitative MR imaging biomarkers have been widely used in clinical practice, while only a select few have been investigated in limited patient cohorts with pancreatic diseases [[5–](#page-11-4)[8\]](#page-11-5). Magnetic resonance cholangiopancreatography (MRCP) can evaluate the pancreatic duct system, and the maximal diameter of the upstream main pancreatic duct (dMPD) was used as an efective imaging biomarker in the diagnosis of AIP [\[9](#page-11-6), [10](#page-11-7)]. Difusion-weighted imaging (DWI) is a technique that assessed the Brownian motion of water molecules noninvasively, and the apparent diffusion coefficient (ADC) values reflected the degree of diffusion restriction $[11]$ $[11]$. Notably, the study findings regarding ADC value, which is the most used quantitative MR imaging biomarker, were controversial, and recent reviews have also pointed to this issue [[12](#page-11-9), [13](#page-11-10)]. Nevertheless, we observed that certain earlier studies confated the concepts of the two IPM entities, namely, MFP and AIP, which exhibit distinct pathological characteristics and appear to difer in their ADC values [[14](#page-11-11)–[17](#page-11-12)]. Intravoxel incoherent motion (IVIM) is an extension of DWI with multiple *b* values that can provide quantitative information on the molecular difusion and microcirculation perfusion effects $[18, 19]$ $[18, 19]$ $[18, 19]$ $[18, 19]$ $[18, 19]$. The following are the IVIM-derived parameters: slow component of diffusion (D_{slow}) represents the pure molecular diffusion, fast component of diffusion (D_{fast}) represents the incoherent microcirculation, and perfusion fraction (*f*) is the difusion fraction related to microcirculation [\[11](#page-11-8)]. Moreover, magnetic resonance elastography (MRE) has emerged as a useful modality for quantitative assessment of mass stifness [\[20](#page-11-15)].

To the best of our knowledge, the above-mentioned imaging biomarkers have not been meta-analyzed to distinguish between IPM and PC.

Therefore, this systematic review and meta-analysis aimed to determine the usefulness of quantitative MR imaging biomarkers for distinguishing between IPM and PC.

Materials and methods

This meta-analysis complied with the Preferred Reporting Items for Systematic Review and Meta-analysis of Diagnostic Test Accuracy Studies (PRISMA-DTA) guidelines $[21]$ $[21]$. Therefore, the requirement for approval from the institutional review board was waived.

Literature search

We searched the PubMed, Embase, Cochrane Library, and Web of Science databases through August 2, 2023, with an English restriction applied. The search strategy consisted of ("pancreatic" OR "pancreas") AND ("cancer*" OR "carcinoma*" OR "malignan*" OR "neoplasm*" OR "adenocarcinoma*") AND ("Pancreatitis") AND ("Magnetic Resonance Imaging" OR "magnetic resonance" OR "MRI" OR "MRCP" OR "MRE" OR "difusionweighted" OR "DWI") OR ("Diagnosis, Diferential" OR "Sensitivity and Specifcity" OR "Predictive Value of Tests" OR "diagnostic performance" OR "diferentia*" OR "sensitiv*" OR "specifcit*" OR "accurac*" OR ("predictive" AND "value")). The detailed search strategy is pre-sented in Supplementary Table [1.](#page-10-0) The reference lists of the relevant studies were also checked manually to identify additional eligible studies.

Study selection

After removing duplicates, two reviewers assessed the relevance of the studies based on the titles and abstracts to remove irrelevant studies. Next, the fulltext manuscripts were retrieved. In this study, we strictly distinguished between the two concepts for clarity: MFP is a type of disease based on chronic pancreatitis (CP) and has no background of AIP, AIP is a distinct disease with no background of MFP, and IPM represents either or a combination of the two. Studies that fulflled the predefned inclusion and exclusion criteria were ultimately assessed as eligible. The inclusion criteria were as follows: (a) patients with IPM or PC, (b) quantitative MR imaging biomarkers, (c) diagnostic performance for distinguishing between IPM and PC, and (d) both observational (retrospective or prospective) and clinical trials. The exclusion criteria were as follows: (a) insufficient data: inability to create a 2×2 contingency table or number of studies for the same MR imaging biomarker was less than two; (b) less than fve patients; (c) mixed patient group for the diagnostic accuracy assessment of ADC, D_{slow} , and D_{fast} ; (d) outlier: the direction of cutoff value of which was opposite to all the other articles of similar or larger patient numbers; (e) other types of articles, such as case reports, review articles, comments, letters, conference abstracts, editorials, or articles published in non-English languages; and (f) articles not available. Disagreements between the reviewers were resolved through discussion to reach consensus.

Data extraction

Data were extracted independently by two reviewers using a standardized form. Discrepancies were resolved by double-checking and discussion to reach consensus. The predesigned data extraction table consisted of four aspects of information: (a) study characteristics: the frst author's name, publication year, country, key conclusions, study design, reference standard, interval between imaging and reference standards, and blinding to the reference standard; (b) patient characteristics: enrollment, number of patients or lesions, age, disease type, and AIP subtype; (c) MRI parameters: MRI unit, sequence, magnetic feld strength, slice thickness, feld of view, region of interest (ROI) size, number of b and b values (s/mm²), repetition time (TR) (ms), and echo time (TE) (ms); (d) outcomes: true positive, false positive, false negative, and true negative numbers and the cutoff values used for diferential diagnosis. If the ADC values were based on multiple *b* values, the raw data of the ADC value with the highest sensitivity and specificity were extracted. If there were several readers for the same MR imaging biomarker,

the sensitivity and specifcity obtained by the reader with the highest accuracy were extracted. In addition, the original authors were contacted in the case of insufficient information.

Quality assessment

Quality assessment was performed using Quality Assessment of Diagnostic Accuracy Studies 2 (QUADAS-2) [[22\]](#page-11-17). Two reviewers independently assessed the risk of bias and applicability concerns in the following four domains: patient selection, index test, reference standard, and flow and timing. Disagreements were resolved through discussions to reach consensus. We did not assign scores to judge the quality of the included studies because each domain of QUADAS-2 had a diferent impact on the study results. Quality assessment forms were plotted using RevMan version 5.4.

Statistical analysis

The DerSimonian-Laird method (random effects model) was used for the meta-analysis. In cases where the cells were devoid of data, a correction of 1/2 was added to each cell. Forest plots were developed to visualize the pooled sensitivity and specifcity with a 95% CI. The statistical heterogeneity of the included studies was assessed using the Cochrane *Q* test and Higgins *I* 2 test. The Cochrane *Q* test ($p < 0.05$) indicated the presence of statistical heterogeneity. An $I²$ value between 20 and 50% indicated moderate heterogeneity, whereas an I^2 value of $> 50\%$ indicated substantial heterogeneity. Moreover, Spearman's rank correlation test was conducted to judge the presence of threshold efects. Because the number of studies for each biomarker was less than 10, the assessment of publication bias was considered unnecessary. Univariate meta-regression analyses were performed using predesigned subgroups to determine potential factors infuencing heterogeneity. All statistical analyses were conducted by a single trained researcher (Z.H.W.) using Meta-DiSc version 1.4 and Stata version 15.0.

Results

Literature search and study selection

A fowchart of the literature screening process is shown in Fig. [1.](#page-3-0) A total of 1819 studies were initially retrieved. After removing 685 duplicates, a further 1030 studies were excluded because of obvious irrelevance. Next, 80 studies were excluded by the full-text review: four articles were not available; 13 articles did not involve a direct comparison of PC and any kind of IPM; eight articles did not report the diagnostic performance of quantitative MR imaging biomarkers; and 39 were

PRISMA 2020 flow diagram for new systematic reviews which included searches of databases and registers only

Fig. 1 Flowchart of the study selection process for the meta-analysis

other types of articles, as specifed in the "[Materials](#page-1-0) [and methods"](#page-1-0) section. Fifteen articles were excluded due to insufficient data. Among the 15 articles, 14 were not able to construct 2×2 contingency tables and one reported the maximal diameter of the upstream main pancreatic duct (dMPD) with a cutoff value other than 4 mm or 5 mm for the diferential diagnosis of AIP and PC [[23](#page-11-18)]. Twenty-fve studies were initially included for data extraction. After comparing the direction of cutoff values for MR imaging biomarkers (higher defined as IPM or lower defned as IPM), the direction of cutof value for ADC values from one study showed obvious deviation from all the other studies which were further excluded to ensure the stability of the study results [[24](#page-11-19)]. Twenty-four studies were included in the final meta-analysis [\[25](#page-11-20)[–48\]](#page-12-0).

During the workflow of study selection and article review, we encountered a paradoxical aspect in the study results concerning the diferentiation between IPM and PC using ADC values. Specifcally, for the diferential diagnosis of MFP and PC, all studies diagnosed MFP with an ADC value higher than the cutoff value, whereas for the diferential diagnosis of AIP and PC, all studies diagnosed AIP with an ADC value lower than the cutof

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† Mass-based; *Mean age of total patients; ∆Median age

+Values higher than the cutoff value were diagnosed as IPM; --Values lower than the cutoff value were diagnosed as IPM +Values higher than the cutof value were diagnosed as IPM; −Values lower than the cutof value were diagnosed as IPM

IPM, inflammatory pancreatic mass; PC, pancreatic cancer AIP, autoimmune pancreatitis; MRI, magnetic resonance imaging; R, retrospective; P, prospective; MA, not available; MFP, mass-forming pancreatitis; F, focal type; /inflammatory pancreatic mass; PC, pancreatic cancer; AlP, autoimmune pancreatitis; MRJ, magnetic resonance imaging; R, retrospective; P, prospective; MA, not available; MFP, mass-forming pancreatitis; F, focal type; D, diffuse-type; ADC, apparent diffusion coefficient; f, perfusion fraction; dMPD, maximal diameter of the upstream main pancreatic duct *D*, difuse-type; *ADC*, apparent difusion coefcient; *f*, perfusion fraction; *dMPD*, maximal diameter of the upstream main pancreatic duct

value. Accordingly, the two IPMs were analyzed separately for the ADC values.

Data extraction and quality assessment

The characteristics of the included studies are summa-rized in Table [1.](#page-4-0) The study of Klauss et al $[49]$ $[49]$ $[49]$ reported three sensitivities and specifcities based on diferent *b* values, and we extracted the one with the highest sensitivity and specificity, which was $b = 200 \text{ s/mm}^2$ $b = 200 \text{ s/mm}^2$ $b = 200 \text{ s/mm}^2$. Figures 2 and [3](#page-7-0) show the results of the quality assessment of the included studies using QUADAS-2. Among the included studies, 18 studies were retrospective, and six were prospective. For patient selection, eight studies were marked as having a high risk of bias because of their case-control design. Eighteen studies, reporting the diagnostic efficacy of the ADC, *f*, or mass stiffness, in which the cutoff values in 18 studies were all determined by the point of the largest Youden index or the point providing the balance between sensitivity and specifcity on the ROC curves, were therefore marked as having an unclear risk of bias in the domain of the index test. For reference standards, 16 studies were marked as having an unclear risk of bias due to the absence of information on whether the researchers were blinded to the results of the index tests during the implementation of the reference standard. As fve studies did not include all patients in the fnal analysis for various reasons (such as suboptimal imaging quality, imaging failure, incomplete imaging workup, and complications of other diseases), they were marked as high risk in the domain of flow and timing. Furthermore, nine studies were labeled with an unclear risk of bias concerning the unclear intervals between the index tests and the reference standards, as these details were not reported. There were no concerns regarding the applicability of the included studies.

Diagnostic performance of MR imaging biomarkers

The diagnostic performances of the quantitative MR imaging biomarkers are shown in Table [2.](#page-8-0) The study results of using ADC values to diferentiate IPM from PC were controversial, but we noticed that the MFP vs. PC and AIP vs. PC groups had opposite directions concerning the cutoff value. The mean or median ADC values of the IPM and PC in individual studies are shown in Fig. [4](#page-8-1). In the MFP vs. PC group, masses exhibiting higher ADC values were identifed as MFP, while those with lower ADC values were diagnosed as AIP. This distinction underscores the importance of not confating these two types of IPM in DWI assessment. Hence, the diagnostic efficacy of the ADC values was pooled separately for the two IPM subgroups.

In the diferentiation between MFP and PC, the ADC value had a sensitivity of 0.80 (95%CI 0.61–0.92) and a specifcity of 0.85 (95%CI 0.77–0.92). For distinguishing AIP and PC, the ADC value had a sensitivity of 0.82 (95%CI 0.75, 0.87) and a specifcity of 0.84 (95%CI 0.81, 0.87). Additionally, for distinguishing IPM and PC, both *f* and mass stifness showed relatively high sensitivities (0.82, 95%CI 0.68–0.91; 0.82, 95%CI 0.71–0.91) with moderate specifcities (0.68, 95%CI 0.61–0.74; 0.77, 95%CI 0.68–0.84). To distinguish between AIP and PC, $dMPD \leq 5$ mm demonstrated the highest sensitivity (0.97, 95%CI 0.93–0.99) and diagnostic odds ratio (46, 95%CI 17–126) for distinguishing AIP from PC, but the specifcity was relatively low (0.52, 95%CI 0.47–0.58). Thus, $dMPD > 5$ mm may be considered an ideal cutoff value for excluding AIP.

Forest plots of the pooled sensitivity and specifcity are shown in Supplementary Figures $1-3$. For the diagnostic performance of all imaging biomarkers, the Cochrane *p*-values indicated the presence of heterogeneity and the I^2 values showed high heterogeneity among most studies. The lowest heterogeneity was not only found in sensitivity of *f* and specifcity of stifness for distinguishing IPM and PC ($p = 0.391$, $I^2 =$ 4.1%), but also found in specificity of dMPD \leq 4 mm and sensitivity of $dMPD \leq 5$ mm for distinguishing AIP and PC. The Spearman correlation coefficient (Supplementary Table [2\)](#page-10-0) revealed a considerable threshold efect for distinguishing IPM and PC using mass stifness and diferentiating MFP from PC using ADC values. No signifcant threshold efects were found for the diagnostic performance of other MR imaging biomarkers. Furthermore, univariate meta-regression analysis was conducted to identify other potential sources of heterogeneity.

Univariate meta‑regression analysis

Univariate meta-regression analysis was performed to identify the potential factors infuencing heterogeneity among the studies, and the results are shown in Table [3](#page-9-0). For distinguishing AIP and PC, the sensitivity (0.85, 95%CI 0.77–0.93) of ADC values with high feld strength (3.0T or mixed) outperformed the sensitivity (0.75, 95%CI 0.61–0.89) of ADC values with low feld strength (1.5T). The ADC values using two b values showed higher sensitivity (0.86, 95%CI 0.80–0.93) than the ADC values using multiple *b* values (0.66, 95%CI 0.50–0.83), but no signifcant heterogeneity was observed for the specifcity. The pooled specificity of the dMPD \leq 5 mm was higher in studies conducted in Japan (0.86, 95%CI 0.72–1.00) than studies conducted in other countries (0.45, 95%CI 0.24–0.64), whereas the specifcity did not exhibit signifcant heterogeneity. Owing to the limited number of studies, we did not conduct a subgroup analysis of other quantitative MR imaging biomarkers.

Discussion

In this review, relevant studies on quantitative MR imaging biomarkers for distinguishing between IPM and PC were systematically reviewed. Thereafter, we conducted an analysis to assess the combined diagnostic performance of four quantitative MR imaging biomarkers in distinguishing between IPM and PC, ADC, *f*, mass stifness, and dMPD. All these biomarkers had relatively high diagnostic efficacy, among which the ADC value and dMPD represented the most commonly used MR imaging biomarkers with the best availability.

The ADC values showed distinct manifestations in MFP and AIP, which might be related to their respective pathological characteristics. Notably, although MFP and AIP are both special forms of CP that exhibit "mass-like" appearances, they are diferent entities with distinctive pathological features $[50]$. The main pathological changes

Fig. 2 Methodological quality assessment graph of included studies using QUADAS-2: the risk of bias and applicability concerns about each domain presented as percentages across included studies

Fig. 3 Methodological quality assessment summary of included studies using QUADAS-2: the risk of bias and applicability concerns about each domain presented as low, unclear, or high risk

Biomarkers	No. of studies	SEN (95% CI), I^2	SPE (95% CI), l^2	+LR (95% CI), I^2	$-LR$ (95% CI), l^2	DOR (95% CI), I^2
Favor IPM						
Higher f	6	$0.82(0.68, 0.91), 4.1\%$	0.68 (0.61, 0.74), 84.0%			3.15 (1.78, 5.55), 75.2% 0.33 (0.18, 0.58), 0.0% 10.57 (4.47, 24.99), 0.0%
Lower mass stiffness	3	0.82 (0.71, 0.91), 77.5%	0.77 (0.68, 0.84), 31.6%			3.49 (2.51, 4.84), 0.0% 0.24 (0.08, 0.71), 73.3% 16.83 (7.21, 39.29), 0.0%
Favor MFP						
Higher ADC	3		0.80 (0.61, 0.92), 77.7% 0.85 (0.77, 0.92), 77.2%			4.40 (2.09, 9.29), 50.4% 0.26 (0.60, 1.13), 71.8% 26.32 (7.73, 89.60), 0.0%
Favor AIP						
Lower ADC	9	0.82 (0.75, 0.87), 49.5%	0.84 (0.81, 0.87), 82.8%			4.80 (3.09, 7.44), 72.5% 0.27 (0.17, 0.42), 47.8% 23.04 (11.02, 48.20), 44.9%
$dMPD \leq 4$ mm	$\overline{2}$	0.86 (0.70, 0.95), 64.7% 0.74 (0.64, 0.83), 0.0%		3.42 (2.34, 5.01), 5.7%		0.23 (0.09, 0.58), 7.4% 14.11 (3.94, 50.52), 6.8%
$dMPD \leq 5$ mm 6			0.97 (0.93, 0.99), 23.1% 0.52 (0.47, 0.58), 92.8%	2.23(1.57, 3.19) 88.1%	$0.09(0.04, 0.18), 0.0\%$ 46 (17, 126), 0.0%	

Table 2 Diagnostic performance of quantitative MR imaging biomarkers for diferentiating IPM from PC

IPM, infammatory pancreatic mass; *PC*, pancreatic cancer; *SEN*, sensitivity; *CI*, confdence interval; *SPE*, specifcity; *+LR*, positive likelihood ratio; *−LR*, negative likelihood ratio; DOR, diagnostic odds ratio; *f*, perfusion fraction; *MFP*, mass-forming pancreatitis; *ADC*, apparent diffusion coefficient; *AIP*, autoimmune pancreatitis; *dMPD*, maximal diameter of the upstream main pancreatic duct

Fig. 4 Mean or median ADC value in individual studies

in MFP include varying degrees of fbrosis and irreversible glandular atrophy, which may sometimes be accompanied by dilatation of the main pancreatic duct [\[51](#page-12-3)]. Conversely, AIP is histologically characterized by extensive periductal infltration of numerous lymphocytes and IgG4-positive plasma cells, along with features such as obliterative phlebitis, storiform fbrosis, and infammatory infltrates [[50,](#page-12-2) [52](#page-12-4)–[54\]](#page-12-5). Because of the highly organized microstructure and high cellularity, the difusion of water molecules may be relatively more restricted in AIP. Thus, MFP and AIP may produce different results for diferential diagnosis using DWI- and IVIM-derived parameters. More studies have reported that the ADC values of MFP were signifcantly higher than those of PC [\[16,](#page-11-21) [44,](#page-12-6) [45](#page-12-7), [55](#page-12-8)[–57\]](#page-12-9). Meanwhile, we noticed that for the four studies that explicitly included AIP in the MFP group [[14](#page-11-11)[–17](#page-11-12)], the ADC values in the MFP group tended to decrease signifcantly as the proportion of AIP in the MFP group increased. With an increase in the proportion of AIP, the ADC values in MFP changed from

Table 3 Results of univariate meta-regression: sources of heterogeneity

Statistically signifcant diferences are indicated in bold font (*p* < 0.05)

IPM, infammatory pancreatic mass; *PC*, pancreatic cancer; *f*, perfusion fraction; *MFP*, mass-forming pancreatitis; *AIP*, autoimmune pancreatitis; *MRI*, magnetic resonance imaging; *ADC*, apparent diffusion coefficient; *MPD*, main pancreatic duct

signifcantly higher to no signifcant diference, and then to signifcantly lower than those in PC. Moreover, the meta-analytic pooled sensitivity and specifcity of higher ADC values for the diagnosis of MFP were notably robust. Fortunately, the clinical features of MFP and AIP differ $[10, 58]$ $[10, 58]$ $[10, 58]$ $[10, 58]$. Therefore, when using ADC values

to perform the diferential diagnosis of IPM and PC, it is important to frst determine the subtype of IPM according to the clinical characteristics.

Diferent numbers and magnitudes of *b* values infuence the calculation of ADC values. For the images obtained with low *b* values, the image contrast mainly depends on the T2 signal, without reducing the signalto-noise ratio (SNR) and contrast-to-noise ratio (CNR). With the increase of *b* values, the detection of difusion impediment is more sensitive [\[11](#page-11-8)]. Additionally, SNR is infuenced by the magnitude of feld strength. One study also revealed the existence of intervendor diferences when different field strengths (1.5 T or 3 T) were applied [[59\]](#page-12-11). Due to the heterogeneity of tumors, diferent ROI delineation methods may also afect ADC calculation. For the variation of the above-mentioned MRI parameters, there is a lack of consistency in ADC values among included studies. Future studies are needed to establish a standardize DWI acquisition method.

For IVIM-derived parameters, all included studies on the *f* showed that the values of *f* were higher in IPM than in PC. However, for other parameters, studies with diferent IPM types had the opposite conclusions. Kang et al used the bi-exponential model for the calculation of D_{slow} and D_{fast} , and reported that the median values of D_{slow} and D_{fast} in MFP were higher than those in PC, although there was no signifcant diference in D_{slow} values between the two groups [[38\]](#page-12-12). Kim et al used a mono-exponential model for the calculation and reported that both the median D_{slow} and D_{fast} values of AIP were lower than the median values of PC, whereas no significant difference was observed [[35](#page-12-13)]. In summary, considering the overall trend of previous study fndings and the diferent pathological features of the two diseases, we suggest that MFP and AIP should not be confused when distinguishing IPM and PC with *D*_{slow} and *D*_{fast}. However, for it is more complex and time-consuming than DWI, and high degrees of variability existed due to the application of diferent models, and there is lack of strong evidence to confrm the clinical application value, implementing IVIM analysis remains challenging.

When applying the dMPD to distinguish between IPM and PC, it is necessary to frst determine the subtype of the IPM. Diferentiating between MFP and PC is likely to be difficult because the values often overlap. However, the dMPD performed well in the diferential diagnosis of AIP and PC $[60]$ $[60]$ $[60]$. With the cutoff value of 5 mm, the dMPD has the highest sensitivity, which indicates that dMPD can help exclude patients with AIP.

For the mass stifness, all included studies consistently showed that the values of mass stifness were higher in the IPM than in the PC. MRE of the pancreas is a novel,

non-invasive imaging technique with high reliability and reproducibility. However, MRE of the pancreas is a breath-hold sequence, and its clinical application remains limited owing to the long examination time, high cost, and lower spatial and temporal resolution than routine MRI [[61](#page-12-15), [62](#page-12-16)]. Moreover, the small number of included studies might weaken the results of the meta-analysis. Consequently, development of this technique, standardization of image acquisition, and studies with larger sample sizes are needed to better solve these clinical problems.

This meta-analysis had several limitations. First, the cases of IPM in single-center studies were limited, and a large amount of data presented a non-normal distribution; therefore, there were risks of data drift and bias. Second, some studies did not explicitly report the composition of the patient group classifed as MFP. Consequently, a senior abdominal radiologist carefully read the full text and compared the clinical and laboratory fndings presented in the text with the diagnostic criteria of AIP to determine whether the MFP group included AIP. Third, because the values of these MR imaging biomarkers vary signifcantly with diferent MRI scanners, feld strengths, *b* values, or methods for ROI delineation, it remains difficult to obtain pre-specifed thresholds for diferential diagnosis.

In conclusion, quantitative MR imaging biomarkers performed well in the diferential diagnosis of IPM and PC. Compared with PC, the ADC values were higher in MFP but lower in AIP. The ADC can distinguish PC from MFP or AIP, both with high diagnostic performance, as long as the two IPM types are not mixed together. dMPD can help exclude patients with AIP, especially those with a cutof value of 5 mm.

Abbreviations

Supplementary Information

The online version contains supplementary material available at [https://doi.](https://doi.org/10.1007/s00330-024-10720-9) [org/10.1007/s00330-024-10720-9](https://doi.org/10.1007/s00330-024-10720-9).

Below is the link to the electronic supplementary material. Supplementary fle1 (PDF 885 KB)

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Declarations

Guarantor

The scientifc guarantor of this publication is Professor Hua-dan Xue from Department of Radiology, Peking Union Medical College Hospital, Beijing, China.

Conflict of interest

The authors of this manuscript declare no relationships with any companies, whose products or services may be related to the subject matter of the article.

Statistics and biometry

No complex statistical methods were necessary for this paper.

Informed consent

Written informed consent was not required because this study was a systematic and meta-analysis.

Ethical approval

 Institutional Review Board approval was not required because this study was a systematic and meta-analysis.

Methodology

- retrospective
- diagnostic study
- performed at one institution

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