# **RESEARCH ARTICLE Open Access**

# Enhancing radiologist's detection: an imaging-based grading system for diferentiating Crohn's disease from ulcerative colitis

Ziman Xiong<sup>1†</sup>, Yan Zhang<sup>2†</sup>, Peili Wu<sup>3†</sup>, Jun Chen<sup>4</sup>, Yaqi Shen<sup>1[\\*](http://orcid.org/0000-0003-0589-8975)</sup> (D, Ihab Kamel<sup>5</sup>, Xianying Zheng<sup>6</sup>, Bing Wu<sup>2†</sup> and Zhen Li<sup>1†</sup>

# **Abstract**

**Background** Delayed diagnosis of inflammatory bowel disease (IBD) is common, there is still no effective imaging system to distinguish Crohn's Disease (CD) and Ulcerative Colitis (UC) patients.

**Methods** This multicenter retrospective study included IBD patients at three centers between January 2012 and May 2022. The intestinal and perianal imaging signs were evaluated. Visceral fat information from CT images was extracted, including the ratio of visceral to subcutaneous fat volume (VSR), fat distribution, and attenuation values. The valuable indicators were screened out in the derivation cohort by binary logistic regression and receiver working curve (ROC) analysis to construct an imaging report and data system for IBD (IBD-RADS), which was tested in the validation cohort.

**Results** The derivation cohort included 606 patients (365 CD, 241 UC), and the validation cohort included 155 patients (97 CD, 58 UC). Asymmetric enhancement (AE) (OR=87.75 [28.69, 268.4]; *P*<0.001), perianal fstula (OR=4.968 [1.807, 13.66]; *P*=0.002) and VSR (OR=1.571 [1.087, 2.280]; *P*=0.04) were independent predictors of CD. VSR improved the efficiency of imaging signs (AUC: 0.929 vs. 0.901;  $P < 0.001$ ), with a threshold greater than 0.97 defined as visceral fat predominance (VFP). In IBD-RADS, AE was the major criterion, VFP and perianal fstula were auxiliary criteria, and intestinal fstula, limited small bowel disease, and skip distribution were special favoring items as their 100% specifcity. Grade 3 to 5 correctly classifed most CD patients (derivation: 96.5% (352/365), validation: 98.0% (95/97)), and 98% of those were eventually diagnosed with CD (derivation: 97.8% (352/360), validation: 98.0% (95/97)).

**Conclusions** IBD-RADS can help radiologists distinguish between CD and UC in patients with suspected IBD.

**Keywords** Infammatory bowel disease, Crohn's disease, Ulcerative colitis, Visceral fat, Diagnosis, Computed tomography

† Ziman Xiong, Yan Zhang and Peili Wu are joint lead authors.

† Bing Wu and Zhen Li are joint senior authors.

\*Correspondence: Yaqi Shen yqshen@hust.edu.cn Full list of author information is available at the end of the article



© The Author(s) 2024. **Open Access** This article is licensed under a Creative Commons Attribution-NonCommercial-NoDerivatives 4.0 International License, which permits any non-commercial use, sharing, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if you modifed the licensed material. You do not have permission under this licence to share adapted material derived from this article or parts of it. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit<http://creativecommons.org/licenses/by-nc-nd/4.0/>.

# **Background**

Infammatory bowel disease (IBD) is a recurrent chronic intestinal infammatory condition, mainly including Crohn's disease (CD) and ulcerative colitis (UC). The worldwide prevalence of IBD continues to rise, afecting an estimated seven million individuals [\[1](#page-12-0)]. Diagnosis difficulties, especially in early stages with intermittent symptoms, may lead to underestimation of actual cases. Delayed diagnosis is common, with reports indicating approximately 10% of patients endured gastrointestinal symptoms for at least fve years before confrmation [\[2](#page-12-1)]. Long-term accumulation of infammation can cause progressive intestinal damage, thereby elevating the risks of strictures, penetrating lesions, and even malignancy [\[3](#page-12-2)]. The association between delayed diagnosis and increased surgery risk has been demonstrated [\[4](#page-12-3)]. Moreover, since CD and UC difer in disease behavior and burden, CD patients usually face greater risks of complications and bowel resection, requiring longer hospital stays and higher medical costs  $[5, 6]$  $[5, 6]$  $[5, 6]$  $[5, 6]$ . Therefore, timely and accurate diagnosis is crucial, as it could potentially lead to earlier initiation of biologic therapy and halting disease progression.

The diagnosis of IBD currently relies on a comprehensive assessment of the clinical data and various examination results by a multidisciplinary team. However, atypical symptoms, endoscopic limitations, and low histological positive rates reduce the reliability of these results [\[7–](#page-12-6)[9\]](#page-12-7). "Endoscopic Skipping," as was previously described, occurs when endoscopy fails to detect proximal small bowel infammation or infammation confned to the intestinal wall [\[8](#page-12-8), [10](#page-12-9)]. A study including 1,471 CD patients found that 8% had ileal active lesions detectable only by computed tomography and magnetic resonance enterography (CTE/MRE), suggesting that imaging severity should be considered when discrepancies exists between radiology and ileoscopy  $[11]$  $[11]$ . These findings demonstrate the value of radiological fndings in the early detection of IBD. Notably, compared to endoscopic mucosal healing, achieving transmural healing as seen on cross-sectional imaging is increasingly recognized as a more important treatment goal in CD, refecting a deeper and more comprehensive response to therapy [[12\]](#page-12-11). CTE/ MRE is routinely used in current guidelines to assess discontinuous segmental lesions, ulcers, and fstulas, complementing endoscopic and histological fndings [\[13](#page-12-12)]. In addition to displaying intestinal and extraintestinal lesions, CTE/MRE also provides anatomic information that can be used for body composition analysis [\[14,](#page-12-13) [15](#page-12-14)]. Previous studies have successfully utilized radiological features extracted from visceral adipose tissue (VAT) to distinguish CD from UC [\[16](#page-12-15)]. Additionally, VAT quantitative parameters obtained by CTE are related to more complex behavior and worse prognosis in IBD [\[15](#page-12-14), [17](#page-12-16), [18\]](#page-12-17). Nonetheless, the previous complex analysis, especially in diferentiating IBD subtypes, and the lack of interpretation of intestinal lesions in CT images, has hindered the adoption of the aforementioned conclusions in clinical practice.

Currently, established imaging reporting and grading systems, such as LI-RADS for the liver [\[19\]](#page-12-18), BI-RADS for the breast  $[20]$  $[20]$ , and PI-RADS for the prostate  $[21]$  $[21]$ , have signifcantly enhanced disease recognition and diagnostic interpretation by radiologists. Developing a similar grading system for IBD patients, like IBD-RADS, would further leverage the strengths of cross-sectional imaging in detecting infammation confned to the intestinal wall, aligning with current diagnostic and therapeutic goals. Additionally, integrating it into clinical workflows would enable radiologists to focus on critical signs and produce more targeted imaging reports for suspected cases. Gastroenterologists would also beneft from standardized reports, enhancing communication among departments and providing crucial evidence, especially in cases with atypical endoscopic results. However, such an approach is lagging in the diagnosis of IBD. Therefore, the purpose of this study was to establish an IBD imaging report and data system (IBD-RADS) for the identifcation of diferent subtypes using the information provided by baseline imaging data of IBD patients.

#### **Methods**

# **Ethics statement**

The multicenter retrospective study followed the Declaration of Helsinki, analyzed patients with IBD at three hospitals in China (Tongji Hospital of Huazhong University of Science and Technology, West China Hospital of Sichuan University, and the First Afliated Hospital of Fujian Medical University), and obtained the consent of the ethics committee of each institution, where informed consent was waived due to the anonymity of the data.

#### **Patient cohorts**

We collected two patient cohorts, including a derivation cohort for IBD-RADs construction and a subsequent validation cohort. The derivation cohort included IBD patients from three institutions between 2012 and 2021, and the inclusion criteria were: (a) diagnosis of CD or UC determined by a multidisciplinary team based on the latest guidelines at the time; (b) patients underwent CTE scans on admission; (c) age  $\geq$  18 years old. Patients with incomplete or poor-quality CT images or with history of previous bowel resection were excluded. Newly diagnosed IBD patients between January and May 2022 were included as the validation cohort, and the inclusion and exclusion criteria were consistent with the derivation

cohort. The gender, age, height, weight, baseline laboratory indicators (C-reactive protein (CRP), erythrocyte sedimentation rate (ESR) and serum albumin (Alb)) and the distribution of intestinal lesions based on imaging, endoscopy and histological results were recorded. In a prior study [[15](#page-12-14)], we reported on 316 patients in the current study. The prior report evaluated the discriminative ability of VAT radiomics. The current study included a larger dataset, and proposed a grading system with simplifed quantitative parameters.

#### **Image acquisition and evaluation**

All CTE scans were performed following the latest imaging protocol [\[22\]](#page-12-21). Patient fasted for 4–6 h and avoided gas-producing liquids, then ingested 1000—1500 ml of 2.5% mannitol solution before the scan. After pre-contrast scanning, a contrast-enhanced CT was performed after a rapid bolus of iopromide (Ultravist 370, 370 mg/ mL, Bayer Schering Pharma, Berlin, Germany) (1.5 mL/ kg) at a rate of 3—5 mL/s, followed by a 20 mL saline fush using a power injector. Images were routinely acquired in the arterial, intestinal, or portal venous phases.

Two radiologists (Z.X. and Y.L., with 4 years of experience) independently evaluated images blinded to the clinical information. Radiologists evaluated the derivation cohort based on their own clinical experience. They assessed active inflammation of the proximal small intestine (including jejunum and proximal ileum), terminal ileum (TI), and colorectum on CTE, using signs such as intestinal wall thickening ( $\geq$  3 mm), mucosal enhancement, intestinal stricture (with or without upstream intestinal dilatation), and intestinal fstula formation [\[23](#page-12-22)]. A lesion involving a single segment was defned as single-segmental lesion, whereas lesions involving multiple sites within a single segment or those involving multiple segments were defned as multi-segmental lesions. Active infammatory regions on CT images that extend continuously along the bowel were defned as continuous lesions, and those distributed in multiple areas with normal segments in between were defned as skip lesions. Moreover, asymmetric enhancement (AE) of the intestinal wall along the mesenteric border, a characteristic fnding of CD  $[23]$  $[23]$  $[23]$ , along with the presence of intestinal fistula, were recorded as "present" or "absent", with the assessment of AE referencing Figure S1 (Additional fle 1: Fig. S1). Given the limited resolution of CT images, patients with suspected IBD at participating institutions have routinely undergone pelvic MRI upon admission to assess for perianal lesions since 2016. Therefore, for patients who have undergone MRI scans, pelvic MRI scans were used to confrm the presence of perianal fstula, characterized by a hyperintensity track on T2-weighted sequences, regardless of fat suppression, that is connected to the internal orifce of the anorectum [[24,](#page-12-23) [25\]](#page-12-24). For patients from 2012 to 2015, their perianal fstulas were identifed through a combination of CT images, previous perianal surgeries, clinical symptoms, and physical examinations. After fnishing the evaluation of the derivation cohort, the two radiologists were trained in radiological diagnosis of IBD and evaluated the validation cohort using the same criteria three weeks later. The results of the two evaluators were compared, and any discrepancies were adjudicated by a senior radiologist (Y.S.), with 13 years of experience.

## **Image segmentation and fat parameter extraction**

Based on a previously developed VAT automatic segmentation algorithm [[26](#page-12-25), [27](#page-12-26)], we incorporated new labels including subcutaneous adipose tissue (SAT) and skeletal muscle, obtaining a comprehensive segmentation model, as shown in Fig. [1](#page-3-0). To ensure segmentation consistency, arterial-phase CT images of all patients were selected and input into the automated segmentation model, which labels and outputs various components. To minimize heterogeneity from diferent imaging sources, we normalized both spatial and intensity before feeding the images into the neural network for processing. Although the model has demonstrated high segmentation accuracy in previous studies [[27](#page-12-26)], the output volumes of interest (VOIs) were individually reviewed and manually adjusted to ensure accuracy. The calibrated VOIs were used to extract parameter information. The current study focused only on the segmentation results of VAT and SAT using arterial phase CT images. The fat parameters related to VAT content, distribution and attenuation were calculated using the segmentation results. Due to incomplete SAT scans in obese patients within the pelvic region, we only analyzed the soft tissue in the lumbar region (the upper border of the frst lumbar vertebra to the lower border of the fifth lumbar vertebra). The volume ratio of VAT and SAT, denoted as Visceral-to-Subcutaneous Fat Ratio (VSR), can be expressed as:

$$
VSR = \frac{\text{Number of SAT pixels}}{\text{Number of }VAT pixels}
$$

This formula calculates VSR by dividing the total count of pixels representing VAT by the total count of pixels representing SAT. Additionally, we calculated the VAT area in each slice within the lumbar region, and then calculated the mean, standard deviation (SD),



<span id="page-3-0"></span>Fig. 1 Overall flowchart of the patient inclusion and analysis process. CD, Crohn's disease; UC, Ulcerative colitis; ROC, Receiver operating characteristic curves

and coefficient of variation  $(CV)$  of areas in the region to refect the uniformity of VAT distribution. We also extracted CT attenuation values of all VAT pixels in the region and calculated the median, 25% quartile, and 75% quartile.

# **Statistical analysis**

The automatic segmentation and quantitative analysis of fat parameters were performed using Python version 3.7, while the statistical analysis was conducted using SPSS 26.0 and MedCalc Statistical Software version 20.100. Based on the distribution of the data, we used Student's t-test or Mann–Whitney U test, chi-square test or Fisher's exact test to compare the diferences in various indicators between IBD patients, derivation cohort and validation cohort. Binary logistic regression was used in the derivation cohort to select the predictive factors. Univariate analysis was frst performed, and then variables with a  $P < 0.05$  were included in the multivariate analysis. Based on the results of above analysis, the diagnostic performance of individual and combined indicators was evaluated using receiver operating characteristic

curves (ROC) and Precision-Recall (PR) curve analysis. The cutoff value of VSR for distinguishing CD from UC was determined using the Youden index in the derivation cohort, and a value above this cutof indicates that VAT constitutes the majority of the adipose tissue compared to SAT, which is defned as "Visceral Fat Predominance (VFP)." The development of IBD-RADS is based on key indicators identifed from the derivation cohort analysis. These indicators were subsequently validated through diagnostic performance analysis in the validation cohort, including ROC and PR curve analysis. The comprehensive integrated discrimination index (IDI) was also calculated. In addition, the consistency of the two radiologists in image evaluation was evaluated by the Kappa coeffcient (<0.4: fair; 0.4–0.6: moderate; 0.6–0.8: substantial;>0.8: almost perfect). Statistical signifcance was set at  $\alpha$  = 0.05 (two-sided).

#### **Results**

#### **Patient demographic characteristics**

Figure [1](#page-3-0) shows the inclusion flowchart. We excluded 98 patients with incomplete or poor image quality from 704 patients and eventually enrolled 365 CD and 241 UC patients for the construction of IBD-RADS (*n*=606). For validation, we selected 155 newly diagnosed IBD patients in a subsequent period. Table [1](#page-4-0) summarizes the baseline characteristics of all patients. The median age of CD patients was around 30 years, while that of UC patients was 40 years, consistent in both cohorts. CD patients were predominantly male and had higher levels of infammatory markers, as well as lower body mass index and Alb levels. In CD patients, the lesions were mainly distributed in the ileocolon (56.2% in derivation and 66.0% in validation) followed by the ileum (27.1% in derivation and 22.7% in validation); while the majority of UC patients had difuse lesions (53.1% in derivation and 53.4% in validation), followed by left-sided colon lesions  $(32.4\%$  in derivation and  $32.8\%$  in validation). There was no statistical diference in lesion location between the two cohorts  $(P=0.20$  and 0.99).

#### **Comparison of radiological results between CD and UC**

Comparisons of imaging signs and fat parameters between IBD patients in both cohorts are summarized in Table [2](#page-5-0). The differences of imaging signs were consistent in the two cohorts. Although infammation in the TI was predominantly in CD patients, it was also found in sixty-seven UC patients. Infammation in the proximal small bowels and lesions confned to small bowels only existed in CD. Lesions in IBD patients were mainly multi-segmental, with CD primarily afecting the ileocolonic region and UC affecting the colon. The lesion distribution of UC patients was continuous, while most CD patients exhibited a skip pattern (76.2% and 82.5%).

<span id="page-4-0"></span>



*CD* Crohn's disease, *UC* Ulcerative colitis, *CRP* C-reactive protein, *ESR* Erythrocyte sedimentation rate, *Alb* Serum albumin

\* *P*<0.05 is considered a signifcant diference

<sup>a</sup> Comparison of various indicators between the derivation and the validation cohort

# <span id="page-5-0"></span>**Table 2** Radiological evaluation and analysis of all patients





*CD* Crohn's disease, *UC* Ulcerative colitis, *SB* Small bowel, *VSR* Visceral-to-subcutaneous fat ratio, *VAT* visceral adipose tissue

\* *P*<0.05 is considered a signifcant diference

<sup>a</sup> Proximal small intestine: including jejunum and proximal ileum

The proportion of AE was higher in CD patients, reaching 78.6% (287/365) and 86.6% (84/97) in the derivation and validation cohorts, respectively. Except for twenty patients with CD and fourteen patients with UC in the derivation cohort, all other patients underwent pelvic MRI scans. Perianal fstula was more common in CD

patients, and intestinal fstula was only observed in CD. For quantitative parameters, CD patients had a greater VSR in both cohorts (*P*<0.001 and *P*=0.02); for VAT distribution, although VAT content was lower in CD, their CV was larger  $(P=0.004$  and  $P=0.07)$ ; moreover, the attenuation values in CD were generally higher, especially 75% quartile (<0.001 and *P* = 0.02).

#### **Screening and validation of diagnostic indicators**

Logistic regression analysis included clinical indicators, imaging signs (AE and perianal fstula), and quantitative parameters (VSR, CV and attenuation). Limited small bowel lesions, intestinal fstula, and skip distribution were excluded because they were not observed in UC cases, which prevented model convergence. Multivariate analysis revealed that age, AE, perianal fistula, and VSR were signifcant predictors of CD (Additional fle 2: Table S1). ROC analysis showed that the specifcity of limited small bowel lesions, intestinal fstula, and skip distribution reached 100%, and AE also showed good diagnostic performance in distinguishing between CD and UC (area under the curve, AUC, 0.877 [0.848, 0.902]). Perianal fstula (AUC, 0.639 [0.600, 0.678]) and VSR (AUC, 0.657 [0.617, 0.694]) showed similar diagnostic performance  $(P=0.52)$ , with a VSR cut-off value of 0.97 for defining "VFP". The clinical indicators of age (AUC, 0.732 [0.695, 0.767]), BMI (AUC, 0.697 [0.650, 0.741]), and CRP (AUC, 0.670 [0.629, 0.709]) also performed well. Details are summarized in Table S2 (Additional fle 2: Table S2).

We compared the diagnostic performance of single and combined indicators, as summarized in Table [3](#page-6-0). The joint indicator performed better than a single indicator, regardless of the cohort. Figure [2](#page-7-0) shows the ROC and PR curves for both cohorts. In the derivation cohort, the AUC of the joint indicator was greater than that of a single sign (*P*<0.001), and IDI analysis showed the improvement in discrimination ability. There was no signifcant diference when AE was combined with perianal fistula or VSR  $(P=0.27)$ . The combination of AE, perianal fstula and VSR obtained the largest AUC, which was significantly larger than  $AE$  + perianal fistula ( $P$ <0.001) and  $AE+VSR$  ( $P=0.03$ ). The same trend was also observed in the validation cohort. Additionally, the comparison of AUC among the infammatory marker CRP, body mass index, and various imaging markers showed that CRP and body mass index were similar to perianal fstula (*P*=0.43 and 0.21) and VSR (*P*=0.68 and 0.32), but significantly lower than AE (both  $P < 0.001$ ) and combined imaging markers (both *P*<0.001).

#### **Construction and validation of IBD‑RADS**

The IBD-RADS based on the above analysis are summarized in Fig. [3](#page-8-0). In IBD-RADS, AE was the major criterion, and perianal fstula and VFP were auxiliary criteria. Limited small bowel disease, intestinal-fstula, and skip distribution were highly specifc indicators, favoring the diagnosis of CD in particular. We proposed fve grades according to the above indicators, and Fig. [3](#page-8-0) shows the grade distribution in IBD patients, as detailed in Table [4](#page-8-1). Grade 4 and 5 can be initially diagnosed as CD, with 94.3% (derivation) and 95.8% (validation) of CD patients being classifed. Grade 3 met only the major criterion and was likely to be diagnosed with CD (57.1% (8/50) and. 50.0% (2/4)), with 2.2% (10/462) of CD patients classifed into this category. Grade 1 and 2 did not meet the major criterion. Among them, Grade 1 did not have any imaging signs mentioned above, were less likely to be diagnosed with CD (3.6% (6/167) and 2.5% (1/40)) and preferred UC. Grade 2 met only the auxiliary criteria and also preferred UC. Figure [4](#page-9-0) shows imaging and

<span id="page-6-0"></span>



*AUC* Area under the curve, *AUPRC* Area under the precision-recall curve, *PPV* Positive predictive value, and *NPV* Negative predictive value, *IDI* Integrated discrimination improvement, *AE* Asymmetric enhancement, *VSR* Visceral-to-subcutaneous fat ratio



<span id="page-7-0"></span>**Fig. 2** The Receiver operating characteristic and Precision-Recall curves of derivation and validation cohorts. **a**-**b** In the derivation cohort, the AUC of AE was 0.877, and no signifcant diference was observed when AE combined with perianal fstula or VSR (AUC: 0.901 vs. 0.912; *P*=0.27). The combination of three indicators obtained the largest AUC (0.929), signifcantly larger than AE+perianal fstula (0.901; *P*<0.001) and AE+VSR (0.912; *P*=0.03). The AUPRC of imaging signs combined with VSR was greater than that of combined imaging signs alone (0.961 vs. 0.946). **c**-**d** In the validation cohort, the AUC of AE was 0.916. The combination of three indicators also obtained the largest AUC (0.964) and AUPRC (0.983 vs. 0.981). AUC, area under the curve; AE, Asymmetric enhancement; VSR, Visceral-to-subcutaneous fat ratio; AUPRC, area under the precision-recall curve

endoscopic images of three patients classifed as Grade 5b (a-b) and Grade 1 (c), respectively.

#### **Interobserver reproducibility**

The Kappa coefficients for each imaging sign are summarized in Table S3 (Additional fle 2: Table S3). Whether in which cohort, the consistency of indicators was between substantial and almost perfect, with the consistency of UC generally higher than that of the CD group. After training, the consistency of the evaluators in assessing the validation cohort signifcantly improved, as refected in each item.

## **Discussion**

We identifed discriminative imaging features and quantitative parameters from baseline radiological examinations of IBD patients upon admission. Subsequently, an imaging-based grading system, IBD-RADS, specifcally designed for CD was constructed and validated. IBD-RADS highlights the importance of radiological fndings and the complementary role of quantitative parameters to imaging signs. Notably, Grade 3 to 5 correctly classifed most CD patients (derivation: 96.5%, validation: 98.0%), making it valuable for the initial stratifcation of clinically suspected IBD patients.





<span id="page-8-0"></span>**Fig. 3** Criterion, defnitions, and interpretations of IBD-RADS, and its distribution in the two cohorts. IBD-RADS includes one major criterion, two auxiliary criteria, and three special support items. The grading system classifes patients into fve grades, with Grade 4 and 5 further subdivided into three and two categories, respectively. Based on the distribution in the derivation and validation cohorts, we recommend that Grade 1 and 2 patients should be initially classifed as UC, while Grade 3 and 4 are more indicative of CD. Patients classifed as Grade 5 can be preliminarily classifed as CD. CD, Crohn's disease; UC, Ulcerative colitis



<span id="page-8-1"></span>**Table 4** Distribution of patients in the Derivation and Validation cohorts

*IBD-RADS* Imaging report and data system for infammatory bowel disease, *CD* Crohn's disease, *UC* Ulcerative colitis



<span id="page-9-0"></span>male with CD showed asymmetric enhancement (green arrow) and intestinal fstula (yellow asterisk). The visceral and subcutaneous fat were marker as yellow and blue, respectively, and the VSR is 1.19 (>0.97, visceral fat predominance). He was classifed as Grade 5b. **b** The CTE, pelvic MRI and endoscopic images of a 24-year-old male patient with CD showed discontinuous asymmetric enhancement (green arrow), perianal fstula (yellow arrow) and longitudinal ulcer (green asterisk), and the VSR was 2.55 (>0.97, visceral fat predominance). He was classifed as Grade 5b. **c** The CTE image of a 55-year-old female patient with UC showed symmetric enhancement of the sigmoid colon with a VSR of 0.38 (<0.97). She was classifed as Grade 1. CTE, CT enterography; CD, Crohn's disease; UC, Ulcerative colitis

The IBD-RADS consists of five imaging signs and one quantitative parameter, with AE of the bowel wall along mesenteric border on CTE images serving as the major criterion due to its high sensitivity and specifcity in both cohorts. Longitudinal ulcer along the mesenteric border is a recognized feature of CD, as the mesenteric and antimesenteric borders have diferent blood supply  $[28]$  $[28]$ . The mesenteric border side of TI, a susceptible target for CD, is supplied by short vessels, which act as efective terminal arteries and supply a mucosa more susceptible to ischemia, resulting in preferential ulceration [[29\]](#page-12-28). Imaging signs corresponding to this feature (asymmetric bowel wall thickening, enhancement, and pseudodiverticula on the antimesenteric side) have been described and considered characteristic of active CD  $[23]$  $[23]$  $[23]$ . In this study, we investigated AE, and confrmed that it is a sign that occurrs in 80% of CD patients and is one of the independent predictors of CD. In addition, we also found that the presence of isolated small bowel disease, intestinal fstulas, and skip distribution in the CTE images were three favoring items for the diagnosis, occurring only in CD. However, since these signs can occur in non-IBD population, they are not used as major criteria. Favoring items maximize

their diagnostic utility only when major criteria are met, as various infectious diseases and malignancies can lead to similar imaging fndings [\[30](#page-12-29), [31](#page-12-30)].

Previous guidelines have emphasized the importance of perianal lesions for CD diagnosis [\[13](#page-12-12)]. In the current study, perianal fstula confrmed by imaging was used as an auxiliary criterion, and its addition signifcantly improved the diagnostic performance of the major criterion alone. However, CTE only reveals extensive and obvious lesions, while pelvic MRI is the best method for visualizing the anatomy of fstulas, especially in clinically asymptomatic patients  $[23, 32]$  $[23, 32]$  $[23, 32]$  $[23, 32]$ . Therefore, we recommend suspected IBD patients receive both CTE and pelvic MRI for initial imaging screening. Another auxiliary criterion is VFP, which means a higher proportion of VAT compared with SAT and signifcantly improves the diagnostic performance of using major criterion or imaging signs alone. The role of adipose tissue in IBD is constantly being interpreted, and relevant clinical, imaging and cytomolecular studies are gradually confrming that VAT is an endocrine organ that regulates immunity and infammation rather than just an energy storage tissue [[33\]](#page-12-32). Signifcant diferences in VAT have been observed between patients with CD and UC. In CD patients, increased VAT is often associated with "creeping fat," where mesenteric fat wraps around infamed intestinal segments, a phenomenon that is uncommon in UC patients  $[34]$  $[34]$ . The presence of creeping fat in CD is linked to intestinal fbrosis and disease progression [\[35](#page-12-34)]. SAT levels are primarily linked to nutritional status, whereas VAT accumulation is afected by both nutritional factors and disease processes, underscoring its complex role. The VFP, derived from VSR, which accounts for both VAT and SAT, efectively highlights the critical role of VAT in disease pathology. Previous studies have extracted VAT texture features from CT images to identify IBD subtypes, but manual segmentation and a lack of exploration of intestinal lesions limit their clinical application [[16](#page-12-15)]. Volume-based VSR was also calculated in a study using automatic segmentation, but its predictive ability for CD disease progression is limited [\[17\]](#page-12-16). We speculate that this index has greater diagnostic value, as VFP in a single slice has been proven useful in diferentiating between CD and intestinal tuberculosis [[36–](#page-13-0)[39\]](#page-13-1). To avoid selection bias, we performed analysis of the entire lumbar region and automated the analysis process including segmentation and parameter extraction. Interestingly, despite lower BMI and poorer nutritional status, CD patients have a higher VAT proportion than UC patients, highlighting the crucial role of VFP in disease diagnosis. It is noteworthy that although the VAT distribution and attenuation parameters did not show

statistical signifcance in multivariate analysis, the differences between CD and UC patients were not negligible, thus confrming the value of fat parameters in IBD studies.

Although multiple diagnostic indicators were proposed, our analysis showed that using auxiliary criteria alone cannot efectively stratify IBD patients. Maximum diagnostic efficacy can only be achieved by using a multiparametric apporach. Additionally, integrating IBD-RADS into current clinical workflows is essential to maximize its efectiveness. Radiologists can use this grading system to initially classify suspected IBD patients, expediting diagnosis by gastroenterologists and enabling earlier treatment planning. A standardized grading system can also enhance communication among various healthcare providers in a multidisciplinary team, including radiologists, gastroenterologists, and surgeons, ensuring that all team members share a common understanding of the disease status. Furthermore, it will facilitate data collection for follow-up and monitoring of patient treatment responses. This allows for the accumulation of standardized data across centers, supporting the continuous improvement of the grading system and uncovering its broader applications. The clinical integration of IBD-RADS requires meeting several conditions, with standardized training for radiologists being the most crucial component. Due to the subjectivity of imaging evaluation, even radiologists with similar levels of experience may difer in their interpretation of fndings. Our study results indicate that the consistency of evaluations for all indicators improved among junior radiologists after training. Meanwhile, implementation requires time and resources, such as software updates for automated segmentation models and additional time for system integration into practice. Although an initial investment is necessary, standardized processes can significantly improve diagnostic efficiency and accuracy over the long term. Finally, we suggest establishing a continuous evaluation and feedback mechanism. Regularly updating the grading standards based on the latest research and clinical experience of the multidisciplinary team will help optimize the system's application. However, it is important to note that the imaging-based grading system is a stratifcation tool rather than a diagnostic standard; it may occasionally produce errors, and when necessary, should be used in conjunction with other assessments, such as endoscopic and pathological fndings, to accurately evaluate disease activity.

Our study has several limitations. First, the crosscenter study led to inevitable diferences in equipment, so we selected indicators with greater consistency and accessibility to establish our grading system. Second, the retrospective design may introduce potential selection

bias, as only patients who met the inclusion criteria and had radiological data were included, which may not represent the overall IBD population. Third, our study focused on the diagnostic value of radiology, and the concordance between IBD-RADS and endoscopy needs to be explored further. Fourth, although clinical indicators were compared, they were only used as a reference to the grading system, and were not our focus, but it is worth investigating in the follow-up research. Fifth, the current IBD-RADS requires further prospective validation, including its application to diverse ethnic groups from various regions and comparison with non-IBD intestinal diseases. Sixth, although the criteria were mainly based on CTE, they are equally applicable to MRE, which is debatable considering that MRE is not the preferred choice for the initial diagnosis. Finally, a comparison between intestinal ultrasound and the IBD-RADS system would provide a more comprehensive perspective for clinical practice. However, due to the limitations of the imaging data obtained in this study, such an analysis could not be conducted and warrants further prospective studies.

# **Conclusions**

In conclusion, we propose a new imaging report and data system for clinically suspected IBD patients, aimed at improving the differentiation between CD and UC. This system utilizes easily assessable, consistent imaging signs and stable quantitative parameters obtained through automated calculations, making it well-suited for clinical application. Future research should focus on prospective validation and refning the grading system to optimize its diagnostic performance and explore its integration into routine clinical workflows.

# **Abbreviations**<br>AF Asymm

- Asymmetric enhancement
- Alb Serum albumin
- AUC Area under the curve
- CD Crohn's disease
- CRP C-reactive protein<br>CTE Computed tomod
- Computed tomography enterography
- CV Coefficient of variability
- ESR Erythrocyte sedimentation rate
- IBD Infammatory bowel disease
- MRE Magnetic resonance enterography
- ROC Receiver operating characteristic curves
- SAT Subcutaneous adipose tissue
- SD Standard deviation
- 
- TI Terminal ileum<br>UC Ulcerative colit UC Ulcerative colitis
- VAT Visceral adipose tissue
- VFA Visceral fat area<br>VEP Visceral fat pred
- Visceral fat predominance
- VOI Volume of interest
- VSR Visceral-to-Subcutaneous Fat Ratio

#### **Supplementary Information**

The online version contains supplementary material available at [https://doi.](https://doi.org/10.1186/s12916-024-03669-5) [org/10.1186/s12916-024-03669-5](https://doi.org/10.1186/s12916-024-03669-5).

Supplementary Material 1.

Supplementary Material 2.

#### **Acknowledgements**

Not applicable.

#### **Authors' contributions**

ZX: Data curation, Formal Analysis, Investigation, Methodology, Visualization, Writing – original draft, Writing – review & editing; YZ: Formal Analysis, Investigation, Validation, Visualization, Writing – original draft, Writing – review & editing; PW: Formal Analysis, Investigation, Validation, Visualization, Writing – original draft, Writing – review & editing; JC: Data curation, Formal Analysis, Writing – review & editing; YS: Conceptualization, Funding acquisition, Project administration, Writing – review & editing; IK: Writing – review & editing; XZ: Resources, Supervision, Writing – review & editing; BW: Resources, Supervision, Writing – review & editing; ZL: Resources, Supervision, Funding acquisition, Project administration, Writing – review & editing. All authors read and approved the fnal manuscript.

#### **Funding**

This work was supported by the grants from National Natural Science Foundation of China (NSFC) No. 82071890 and 62131009.

#### **Availability of data and materials**

Code used for automatic segmentation and computation will be made available via GitHub. Data may be made available upon reasonable request and pursuant to appropriate agreements.

#### **Declarations**

#### **Ethics approval and consent to participate**

This multicenter retrospective study was approved by the Research Ethics Committees from each of the participating centers, and informed consent was waived (approval number: TJ-IRB20210836; TJ-IRB20230890; MRCTA,ECFAH of FMU[2023]297).

#### **Consent for publication**

All patients whose images were shown gave their consent for publication.

#### **Competing interests**

The authors declare that they have no competing interests. Additional fles description.

Additional File 1: Figure S1 Example of assessing asymmetric enhancement on computed tomography enterography.

Additional File 2: Table S1-S3.

Table S1 Binary logisic regression analysis of variables in the Derivation cohort. Table S2 Diagnostic analysis of individual indicator in the Derivation cohort. Table S3 The Kappa coefficients of the radiological evaluation items of the two reviewers.

#### **Author details**

<sup>1</sup> Department of Radiology, Tongji Hospital, Tongji Medical College, Huazhong University of Science and Technology, Qiaokou District, 1095 Jiefang Avenue, Wuhan, Hubei 430030, China. <sup>2</sup> Department of Radiology, West China Hospital, Sichuan University, Guoxue Alley, No. 37, Guoxue Alley, Chengdu, Sichuan 610041, China. <sup>3</sup> Department of Radiology, The First Affiliated Hospital of Fujian Medical University, Fuzhou 350005, Fujian, China. <sup>4</sup> Bayer Healthcare, Wuhan, Hubei 430030, China. <sup>5</sup> Department of Radiology, University of Colorado Denver Anschutz Medical Campus, Aurora, CO, USA. <sup>6</sup>Department of Radiology, Fujian Maternity and Child Health Hospital, Fuzhou 350005, Fujian, China.

Received: 19 February 2024 Accepted: 30 September 2024

#### **References**

- <span id="page-12-0"></span>1. Alatab S, Sepanlou SG, Ikuta K, Vahedi H, Bisignano C, Safri S, Sadeghi A, Nixon MR, Abdoli A, Abolhassani H, et al. The global, regional, and national burden of infammatory bowel disease in 195 countries and territories, 1990–2017: a systematic analysis for the global burden of disease study 2017. Lancet Gastroenterol Hepatology. 2020;5(1):17–30.
- <span id="page-12-1"></span>2. Blackwell J, Saxena S, Jayasooriya N, Bottle A, Petersen I, Hotopf M, Alexakis C, Pollok RC. Prevalence and duration of gastrointestinal symptoms before diagnosis of infammatory bowel disease and predictors of timely specialist review: a population-based study. J Crohns Colitis. 2021;15(2):203–11.
- <span id="page-12-2"></span>3. Shah SC, Itzkowitz SH. Colorectal cancer in infammatory bowel disease: mechanisms and management. Gastroenterology. 2022;162(3):715–30.
- <span id="page-12-3"></span>4. Jayasooriya N, Baillie S, Blackwell J, Bottle A, Petersen I, Creese H, Saxena S, Pollok RC. Systematic review with meta-analysis: Time to diagnosis and the impact of delayed diagnosis on clinical outcomes in infammatory bowel disease. Aliment Pharm Ther. 2023;57(6):635–52.
- <span id="page-12-4"></span>5. Frolkis AD, Dykeman J, Negrón ME, DeBruyn J, Jette N, Fiest KM, Frolkis T, Barkema HW, Rioux KP, Panaccione R, et al. Risk of surgery for infammatory bowel diseases has decreased over time: a systematic review and meta-analysis of population-based studies. Gastroenterology. 2013;145(5):996–1006.
- <span id="page-12-5"></span>6. Park KT, Ehrlich OG, Allen JI, Meadows P, Szigethy EM, Henrichsen K, Kim SC, Lawton RC, Murphy SM, Regueiro M, et al. The cost of infammatory bowel disease: an initiative from the Crohn's & Colitis foundation. Infamm Bowel Dis. 2020;26(1):1–10.
- <span id="page-12-6"></span>7. Sakata T, Niwa Y, Goto H, Hirooka Y, Hayakawa T, Ohmiya N, Kobayashi S. Asymptomatic infammatory bowel disease with special reference to ulcerative colitis in apparently healthy persons. AM J GASTROENTEROL. 2001;96(3):735–9.
- <span id="page-12-8"></span>8. Samuel S, Bruining DH, Loftus EV, Becker B, Fletcher JG, Mandrekar JN, Zinsmeister AR, Sandborn WJ. Endoscopic skipping of the distal terminal ileum in Crohn's disease can lead to negative results from ileocolonoscopy. Clin gastroenterol h. 2012;10(11):1253–9.
- <span id="page-12-7"></span>9. McHugh JB, Appelman HD, McKenna BJ. The diagnostic value of endoscopic terminal ileum biopsies. Am J Gastroenterol. 2007;102(5):1084–9.
- <span id="page-12-9"></span>10. Mansuri I, Fletcher JG, Bruining DH, Kolbe AB, Fidler JL, Samuel S, Tung J. Endoscopic skipping of the terminal ileum in pediatric Crohn's disease. Am J Roentgenol. 2017;208(6):W216–24.
- <span id="page-12-10"></span>11. Nehra AK, Sheedy SP, Wells ML, VanBuren WM, Hansel SL, Deepak P, Lee YS, Bruining DH, Fletcher JG. Imaging fndings of ileal infammation at computed tomography and magnetic resonance enterography: what do they mean when ileoscopy and biopsy are negative? J Crohns Colitis. 2020;14(4):455–64.
- <span id="page-12-11"></span>12. D'Amico F, Massironi S, Allocca M, Danese S. Advancing transmural remission as a treatment target in Crohn's disease: the future of tight-control strategy? United Eur Gastroent. 2023;11(10):948–50.
- <span id="page-12-12"></span>13. Bernstein CN, Eliakim A, Fedail S, Fried M, Gearry R, Goh K, Hamid S, Khan AG, Khalif I, Ng SC, et al. World gastroenterology organisation global guidelines infammatory bowel disease: update august 2015. J Clin gastroenterol. 2016;50(10):803–18.
- <span id="page-12-13"></span>14. Weston AD, Korfatis P, Kline TL, Philbrick KA, Kostandy P, Sakinis T, Sugimoto M, Takahashi N, Erickson BJ. Automated Abdominal Segmentation of CT scans for body composition analysis using deep learning. Radiology. 2019;290(3):669–79.
- <span id="page-12-14"></span>15. Bamba S, Inatomi O, Takahashi K, Morita Y, Imai T, Ohno M, Kurihara M, Takebayashi K, Kojima M, Iida H, et al. Assessment of body composition from CT images at the level of the third lumbar vertebra in infammatory bowel disease. Infamm bowel dis. 2021;27(9):1435–42.
- <span id="page-12-15"></span>16. Zhou Z, Xiong Z, Cheng R, Luo Q, Li Y, Xie Q, Xiao P, Hu D, Hu X, Shen Y, et al. Volumetric visceral fat machine learning phenotype on CT for diferential diagnosis of infammatory bowel disease. Eur radiol. 2023;33(3):1862–72.
- <span id="page-12-16"></span>17. Li X, Zhang N, Hu C, Lin Y, Li J, Li Z, Cui E, Shi L, Zhuang X, Li J, et al. CTbased radiomics signature of visceral adipose tissue for prediction of

disease progression in patients with Crohn's disease: a multicentre cohort study. Eclinicalmedicine. 2023;56: 101805.

- <span id="page-12-17"></span>18. Zhou Z, Xiong Z, Xie Q, Xiao P, Zhang Q, Gu J, Li J, Hu D, Hu X, Shen Y, et al. Computed tomography-based multiple body composition parameters predict outcomes in Crohn's disease. Insights Imaging. 2021;12(1):135.
- <span id="page-12-18"></span>19. Chernyak V, Fowler KJ, Kamaya A, Kielar AZ, Elsayes KM, Bashir MR, Kono Y, Do RK, Mitchell DG, Singal AG, et al. Liver Imaging Reporting and Data System (LI-RADS) version 2018: imaging of hepatocellular carcinoma in at-risk patients. Radiology. 2018;289(3):816–30.
- <span id="page-12-19"></span>20. Timmers JMH, van Doorne-Nagtegaal HJ, Zonderland HM, van Tinteren H, Visser O, Verbeek ALM, den Heeten GJ, Broeders MJM. The Breast Imaging Reporting and Data System (BI-RADS) in the Dutch breast cancer screening programme: its role as an assessment and stratifcation tool. Eur radiol. 2012;22(8):1717–23.
- <span id="page-12-20"></span>21. Turkbey B, Rosenkrantz AB, Haider MA, Padhani AR, Villeirs G, Macura KJ, Tempany CM, Choyke PL, Cornud F, Margolis DJ, et al. Prostate imaging reporting and data system version 2.1: 2019 update of prostate imaging reporting and data system version 2. Eur urol. 2019;76(3):340–51.
- <span id="page-12-21"></span>22. Sturm A, Maaser C, Calabrese E, Annese V, Fiorino G, Kucharzik T, Vavricka SR, Verstockt B, van Rheenen P, Tolan D, et al. ECCO-ESGAR guideline for diagnostic assessment in IBD Part 2: IBD scores and general principles and technical aspects. J Crohns Colitis. 2019;13(3):273–84.
- <span id="page-12-22"></span>23. Bruining DH, Zimmermann EM, Loftus EV, Sandborn WJ, Sauer CG, Strong SA. Consensus recommendations for evaluation, interpretation, and utilization of computed tomography and magnetic resonance enterography in patients with small bowel Crohn's isease. Radiology. 2018;286(3):776–99.
- <span id="page-12-23"></span>24. Maaser C, Sturm A, Vavricka SR, Kucharzik T, Fiorino G, Annese V, Calabrese E, Baumgart DC, Bettenworth D, Borralho Nunes P, et al. ECCO-ESGAR guideline for diagnostic assessment in IBD Part 1: Initial diagnosis, monitoring of known IBD, detection of complications. J Crohns Colitis. 2019;13(2):144–64.
- <span id="page-12-24"></span>25. Sheedy SP, Bruining DH, Dozois EJ, Faubion WA, Fletcher JG. MR imaging of perianal Crohn isease. Radiology. 2017;282(3):628–45.
- <span id="page-12-25"></span>26. Li Y, Xiong Z, Jiang Y, Shen Y, Hu X, Hu D, Li Z. Enhancing the diferentiation between intestinal behçet's disease and Crohn's disease through quantitative computed tomography analysis. Bioengineering (Basel, Switzerland). 2023;10(10):1211.
- <span id="page-12-26"></span>27. Xiong Z, Wu P, Zhang Y, Chen J, Shen Y, Kamel I, Wu B, Zheng X, Li Z. Radiological biomarkers refecting visceral fat distribution help distinguish infammatory bowel disease subtypes: a multicenter cross-sectional study. Insights imaging. 2024;15(1):70.
- <span id="page-12-27"></span>28. Anthony A, Pounder RE, Dhillon AP, Wakefeld AJ. Vascular anatomy defnes sites of indomethacin induced jejunal ulceration along the mesenteric margin. Gut. 1997;41(6):763–70.
- <span id="page-12-28"></span>29. Anthony A, Dhillon AP, Pounder RE, Wakefeld AJ. Ulceration of the ileum in Crohn's disease: correlation with vascular anatomy. J Clin pathol. 1997;50(12):1013–7.
- <span id="page-12-29"></span>30. Martinolich J, Croasdale DR, Bhakta AS, Ata A, Chismark AD, Valerian BT, Canete JJ, Lee EC. Laparoscopic Surgery for Diverticular Fistulas: Outcomes of 111 consecutive cases at a single institution. J Gastrointest surg. 2019;23(5):1015–21.
- <span id="page-12-30"></span>31. Kachaamy T, Weber J, Weitz D, Vashi P, Kundranda M. Successful endoscopic management of a malignant ileovesicular fstula. Gastrointest endosc. 2016;84(3):536–7.
- <span id="page-12-31"></span>32. Schwartz DA, Wiersema MJ, Dudiak KM, Fletcher JG, Clain JE, Tremaine WJ, Zinsmeister AR, Norton ID, Boardman LA, Devine RM, et al. A comparison of endoscopic ultrasound, magnetic resonance imaging, and exam under anesthesia for evaluation of Crohn's perianal fstulas. Gastroenterology. 2001;121(5):1064–72.
- <span id="page-12-32"></span>33. Eder P, Adler M, Dobrowolska A, Kamhieh-Milz J, Witowski J. The role of adipose tissue in the pathogenesis and therapeutic outcomes of infammatory bowel disease. Cells-basel. 2019;8(6):628.
- <span id="page-12-33"></span>34. Mao R, Doyon G, Gordon IO, Li J, Lin S, Wang J, Le THN, Elias M, Kurada S, Southern B, et al. Activated intestinal muscle cells promote preadipocyte migration: a novel mechanism for creeping fat formation in Crohn's disease. Gut. 2022;71(1):55–67.
- <span id="page-12-34"></span>35. Li X, Feng S, Cao Q, Coffey JC, Baker ME, Huang L, Fang Z, Qiu Y, Lu B, Chen Z, et al. Degree of creeping fat assessed by computed tomography enterography is associated with intestinal fbrotic stricture in patients

with Crohn's disease: a potentially novel mesenteric creeping fat index. J Crohns Colitis. 2021;15(7):1161–73.

- <span id="page-13-0"></span>36. Ko JK, Lee HL, Kim JO, Song SY, Lee KN, Jun DW, Lee OY, Han DS, Yoon BC, Choi HS, et al. Visceral fat as a useful parameter in the diferential diagno sis of Crohn's disease and intestinal tuberculosis. Intest res. 2014;12(1): 42.
- 37. Kedia S, Madhusudhan KS, Sharma R, Bopanna S, Yadav DP, Goyal S, Jain S, Das P, Dattagupta S, Makharia G, et al. Combination of increased visceral fat and long segment involvement: evelopment and validation of an updated imaging marker for diferentiating Crohn's disease from intestinal tuberculosis. J Gastroen hepatol. 2018;33(6):1234–41.
- 38. Yadav DP, Madhusudhan KS, Kedia S, Sharma R, Pratap Mouli V, Bopanna S, Dhingra R, Pradhan R, Goyal S, Sreenivas V, et al. Development and validation of visceral fat quantifcation as a surrogate marker for diferen tiation of Crohn's disease and intestinal tuberculosis. J Gastroen Hepatol. 2017;32(2):420–6.
- <span id="page-13-1"></span>39. Seetharaman J, Srivastava A, Yadav RR, Singh SK, Mishra P, Sen Sarma M, Poddar U. Visceral fat indices: do they help diferentiate crohn's disease and intestinal tuberculosis in children? J Crohn's Colitis. 2023;17:2026–32.

# **Publisher's Note**

Springer Nature remains neutral with regard to jurisdictional claims in pub lished maps and institutional afliations.