

### A simplified scoring protocol to improve diagnostic accuracy with the breast imaging reporting and data system in breast magnetic resonance imaging

# Yuting Zhong<sup>1,2</sup>, Menglu Li<sup>3</sup>, Jingjin Zhu<sup>2,4</sup>, Boya Zhang<sup>2,4</sup>, Mei Liu<sup>5</sup>, Zhili Wang<sup>6</sup>, Jiandong Wang<sup>2</sup>, Yiqiong Zheng<sup>2</sup>, Liuquan Cheng<sup>3#</sup>, Xiru Li<sup>2#</sup>

<sup>1</sup>Medical School of Chinese People's Liberation Army, Beijing, China; <sup>2</sup>Department of General Surgery, Chinese People's Liberation Army General Hospital, Beijing, China; <sup>3</sup>Department of Radiology, Chinese People's Liberation Army General Hospital, Beijing, China; <sup>4</sup>School of Medicine, Nankai University, Tianjin, China; <sup>5</sup>Department of Pathology, Chinese People's Liberation Army General Hospital, Beijing, China; <sup>6</sup>Department of Ultrasound, Chinese People's Liberation Army General Hospital, Beijing, China;

*Contributions:* (I) Conception and design: X Li, L Cheng; (II) Administrative support: L Cheng, X Li; (III) Provision of study materials or patients: L Cheng, X Li; (IV) Collection and assembly of data: All authors; (V) Data analysis and interpretation: All authors; (VI) Manuscript writing: All authors; (VII) Final approval of manuscript: All authors.

"These authors contributed equally to this work.

*Correspondence to:* Xiru Li. Department of General Surgery, Chinese People's Liberation Army General Hospital, Beijing 100853, China. Email: 2468li@sina.com; Liuquan Cheng. Department of Radiology, Chinese People's Liberation Army General Hospital, Beijing 100853, China. Email: 13910209982@139.com.

**Background:** The breast imaging reporting and data system (BI-RADS) lexicon provides a standardized terminology for describing leision characteristics but does not provide defined rules for converting specific imaging features into diagnostic categories. The inter-reader agreement of the BI-RADS is moderate. In this study, we explored the use of a simplified protocol and scoring system for BI-RADS categorization which integrates the morphologic features (MF), kinetic time-intensity curve (TIC), and apparent diffusion coefficient (ADC) values with equal weights, with a view to providing a convenient and practical method for breast magnetic resonance imaging (MRI) and improving the inter-reader agreement and diagnostic performance of BI-RADS.

**Methods:** This cross-sectional, retrospective, single-center study included 879 patients with 898 histopathologically verified lesions who underwent an MRI scan on a 3.0 Tesla GE Discovery 750 MRI scanner between January 1, 2017, and June 30, 2020. The BI-RADS categorization of the studied lesions was assessed according to the sum of the assigned scores (the presence of malignant MF, lower ADC, and suspicious TIC each warranted a score of +1). Total scores of +2 and +3 were classified as category 5, scores of +1 were classified as category 4, and scores of +0 but with other lesions of interest were classified as category 3. The receiver operating characteristic (ROC) curves were plotted, and the sensitivity, specificity, and accuracy of this categorization were investigated to assess its efficacy and its consistency with pathology.

**Results:** There were 472 malignant, 104 risk, and 322 benign lesions. Our simplified scoring protocol had high diagnostic accuracy, with an area under curve (AUC) value of 0.896. In terms of the borderline effect of pathological risk and category 4 lesions, our results showed that when risk lesions were classified together with malignant ones, the AUC value improved (0.876 *vs.* 0.844 and 0.909 *vs.* 0.900). When category 4 and 5 lesions were classified as malignant, the specificity, accuracy, and AUC value decreased (82.3% *vs.* 93.2%, 89.3% *vs.* 90.2%, and 0.876 *vs.* 0.909, respectively). Therefore, to improve the diagnostic accuracy of the protocol for BI-RADS categorization, only category 5 lesions should be considered to be malignant.

Conclusions: Our simplified scoring protocol that integrates MF, TIC, and ADC values with equal

weights for BI-RADS categorization could improve both the diagnostic performance of the protocol for BI-RADS categorization in clinical practice and the understanding of the benign-risk-malignant breast diseases.

**Keywords:** Breast magnetic resonance imaging (MRI); breast imaging reporting and data system (BI-RADS); scoring protocol; diagnostic accuracy

Submitted Oct 22, 2021. Accepted for publication Apr 19, 2022. doi: 10.21037/qims-21-1036 View this article at: https://dx.doi.org/10.21037/qims-21-1036

### Introduction

Breast magnetic resonance imaging (MRI) is an indispensable modality in the detection of breast tumors (1). Current applications of breast MRI include the staging of known cancers (2-5), contralateral breast examination (6-8), breast cancer screening for women at high risk (9,10), treatment evaluation after neoadjuvant chemotherapy (11), and the evaluation of carcinomas of unknown primary origin (12,13). In 2003, the first edition of the American College of Radiology (ACR) breast imaging reporting and data system (BI-RADS) was published, which provided a structured common language for and standardized the reporting of breast MRI (14). The use of a standardized terminology facilitates communication among physicians and radiologists. The morphologic and functional contrast kinetic features of lesions should therefore be described using the BI-RADS lexicon. However, while breast MRI has high sensitivity, ranging from 94% to 99%, it has relatively low specificity for considering every enhancement as suspicious results in unnecessary biopsies (15,16).

When assessing the likelihood of malignancy on breast MRI in practice, radiologists should integrate multiple complex imaging features and combine patient parameters. However, although both morphological and kinetic lesion features should be considered when describing the findings of breast MRI, the relative importance of these features in predicting malignancy remains controversial (17-19). Years of clinical experience and observation show that junior radiologists and breast surgeons often confuse the methods and rules for converting specific imaging features into diagnostic BI-RADS categories (14). As a result, junior radiologists and breast surgeons often have difficulty reaching a consensus on the BI-RADS category with their senior counterparts. The use of multiple diagnostic criteria is associated with low reading consistency among radiologists (20). As a result, the inter-reader consistency of BI-RADS can be low, and its diagnostic accuracy is highly variable (21-23).

Multiparametric breast MRI protocols have been successfully applied in clinical routine. Dynamic evaluation shows the permeability of the vessels and abnormal vasculature of lesions through the shape of the timeintensity curve (TIC). In benign lesions, persistent increase is commonly observed, whereas a decrease in the late phase is common in malignant lesions. Diffusion-weighted imaging (DWI) is influenced by tissue microstructure and cell density, and quantifies the random movement of water molecules by measuring the apparent diffusion coefficient (ADC). Due to high cellular density, compression of extracellular space, and microstructural changes, malignancies tend to show more restricted water molecule diffusivity with a high signal on DWI and low ADC values (15,24,25).

The purpose of this study was to explore the use of a simplified scoring protocol that integrates the morphologic features (MF), TIC, and ADC values with equal weights to help convert specific imaging features into a diagnostic BI-RADS category and to evaluate the efficacy of this protocol by using histopathology results. We present the following article in accordance with following the STARD reporting checklist (available at https://qims.amegroups.com/article/ view/10.21037/qims-21-1036/rc).

### **Methods**

### Study design

This cross-sectional, retrospective, single-center study was approved by the Ethics Committee of Chinese People's Liberation Army General Hospital (No. S2019-093-01), and the requirement for individual consent was waived due to the retrospective nature of the analysis. The study was conducted in accordance with the Declaration of Helsinki (as revised in 2013).



Figure 1 Patient flow chart of the study. MRI, magnetic resonance imaging.

### Patients

Breast MRI examinations were performed in a routine clinical environment between January 1, 2017, and June 30, 2020. To be included in the study, patients needed to have undergone histopathology either by core biopsy or open surgery as a reference standard after MRI. The exclusion criteria were: (I) patients with a history of biopsy or surgical intervention in the 3 months prior to undergoing MRI examination; and (II) patients whose lesion locations exhibited an evident mismatch between their MRI and surgical or biopsy results. Figure 1 presents the study enrollment flow chart. All patients were also subject to a breast ultrasound and/or digital mammography, either before or after MRI examination. The final surgical treatment, which was either core needle biopsy, vacuumassisted biopsy, or open surgical biopsy, was decided by the surgeons based on all available information.

### Image acquisition

MRI examinations were performed using a 3.0 Tesla MRI scanner with an eight-channel phase array breast coil (Discovery 750, General Electric Healthcare, Milwaukee, WI, USA). The imaging protocol, which lasted for 18 minutes, included four pulse sequences: DWI,  $T_2$ -weighted imaging ( $T_2WI$ ),  $T_1$ -weighted imaging ( $T_1WI$ ), and dynamic contrast enhancement (DCE). All sequences were spatially matched in the axial view, and the field of view was 320, 320, and 190 mm in the Z-axis coverage. The b-value of DWI was 0 and 1,000 s/mm<sup>2</sup> in three orthogonal diffusion gradients, inversion recovery (IR) was 250 ms

#### Zhong et al. A simplified BI-RADS scoring protocol

for fat suppression, time of repetition (TR) was 5,400 ms, minimum time of echo (TE), and the matrix was 128×128. The T<sub>2</sub>WI used iterative decomposition of water and fat with echo asymmetry and least-squares estimation (IDEAL) for fat suppression, TR of 5,000 ms, TE of 68 ms, and a matrix of 320×256. For both T<sub>1</sub>WI and DCE, the same Volume Imaging for Breast Assessment (VIBRANT), spectral-selective inversion recovery (SPECIAL), and threedimensional spoiled gradient recall sequence were used. The SPECIAL option was disabled for non-fat-suppression  $T_1WI$ . The  $T_1WI$  and DCE images had the exact same geometric location, an isotropic spatial resolution of  $1.0 \text{ mm} \times 1.0 \text{ mm} \times 1.0 \text{ mm}$ , 192 partitions in the axial view, minimum TR/TE, and a flip angle of 120°. The DCE scan repeated six continuous phases without interruption, each of which lasted for 120 s. After the completion of the pre-contrast phase, contrast agent (0.5 M Gd-DTPA) was injected through an antecubital vein at a rate of 2 mL/s, 0.1 mmol/kg body weight, and with 20 mL saline flushing.

### Imaging evaluation and the scoring system for BI-RADS categorization

Image processing was carried out on a GE Advantage Windows workstation. All images were studied independently by two attending radiologists, who analyzed their T1 and T2 signal, DWI-ADC, DCE, and kinetics features, and assessed the lesions according to the BI-RADS (14). The MF, TIC, and background parenchymal enhancement (BPE) readings complied with the ACR BI-RADS guidelines. Both radiologists needed to reach a consensus on the subjective MF reading. The first enhanced phase was selected for sagittal and coronal reformation (Figure 2). The early enhancement ratio (EER) was defined as the percentage between the first enhanced phase and the pre-contrast phases. To avoid undesirable issues related to partial volume effects, the TIC curves and ADC values were taken on the detected target lesions. For large and inhomogeneous lesions for which there were multiple regions of interest, only the maximum TIC and minimum ADC were kept for measurement and assessment (*Figure 3*).

The scoring system comprised three suspicious predictors: (I) MF; (II) TIC profile; and (III) ADC value for mass and non-mass enhancement types. As shown in *Table 1*, each suspicious predictor was assigned a score of +1. There were also five modifiers introduced for the specific cases. Finally, lesions were categorized based on the sum of the scores as follows, where the category refers to the BI-RADS



**Figure 2** The proposed multiparametric protocol used DWI,  $T_1WI$ , fat-suppressed  $T_2WI$ , and DCE. (A) Axial fat-suppressed  $T_2WI$ , (B) DWI (b =1,000 s/cm<sup>2</sup>), (C) non-fat-suppressed  $T_1WI$ , and the (D) pre-contrast, (E) first enhanced, and (F) fifth enhanced phases of a six-phase DCE. The bilateral breast was symmetrically inspected on the axial view. The multi-parametric features of the lesions were characterized in a synchronized (spatially matched) way, especially the high signal on DWI and the enhancement profile on DCE images. On MPR images (G) from the early enhanced image (E), the lesion showed a prominent triangular configuration pointing toward the nipple in the axial and sagittal views, and a fan shape on the coronal view, with discernible clustered-ring signs. In contrast, on the MPR images (H) for the delayed enhanced images (F), the border and the internal pattern were obscured by the gradually enhanced BPE, making the lesion less obvious. DWI, diffusion-weighted imaging;  $T_1WI$ , T1-weighted images;  $T_2WI$ , T2-weighted images; DCE, dynamic contrast enhancement; MPR, multi planar reconstruction.

classification:

- ✤ Category 5: the sum of scores was +2 or +3.
- ✤ Category 4: the sum of scores was +1.
- Category 3: the sum of scores was 0. Focus, scattered foci, or asymmetric maximum BPE included.
- Category 2: specific to benign lesions such as cysts, non-enhanced adenoma, fat necrosis, hamartoma, non-enhanced ductal dilation, and symmetric maximum BPE.
- Category 1: normal breast tissue, including symmetric minimum to moderate BPE.

### Histopathology review

A multidisciplinary panel composed of radiologists, surgeons, and pathologists was formed to review the

imaging, surgical, and histopathological information. The lesions were classified either as benign, risk, or malignant (*Table 2*). The risk lesions included atypical ductal hyperplasia, *in situ* lobular neoplasia [atypical lobular hyperplasia (ALH) and lobular carcinoma in situ (LCIS)], papillary lesions, radial scars/complex sclerosing lesions (RS/ CSL), and myoepithelial tumors (phyllodes). These lesions had uncertain malignant potential and were classified as B3 according to the European and British guidelines (26-28). If there was more than one component inside a lesion, only the most suspicious component was recorded.

### Statistical analysis

Statistical processing was employed at the lesion-based level. To calibrate lesions with a traditional malignant-to-



**Figure 3** Introduction of the modifiers of the protocol for certain specific cases. Spatial matched  $T_2WI$  (A), DWI (B), and DCE (C) images, with the non-enhanced (\*) component corresponding to the central, hyperintense part on DWI and  $T_2WI$ . The lesion (arrow) appeared as a regional distribution on the axial view (C) but showed a typical segmentation on the reformatted sagittal view (D) (with a score of +1). The ADC value was  $0.979 \times 10^{-3} \text{ mm}^2/\text{s}$  (with a score of +1). The most prominent TIC curve is the plateau. The sum of the scores was 3 before the modifier was considered. The lower ADC component on DWI corresponded to the non-enhanced part on DCE and gave a correction modifier of -1, with respect to the category level. The final assessment was therefore a category 4 lesion with predicted mastitis, and biopsy was subsequently recommended. Histopathology revealed pus and inflammation, indicating NPM (ductal ectasia) with abscess.  $T_2WI$ , T2-weighted images; DWI, diffusion-weighted imaging; DCE, dynamic contrast enhancement; ADC, apparent diffusion coefficient; TIC, time-intensity curve; NPM, non-puerperal mastitis.

benign differentiation system, the risk lesions were grouped with other lesions that were either benign or malignant in pathology, while the category 4 lesions were grouped with either category 5 or category  $\leq$ 3 lesions in the final assessment. To assess the proposed scoring system, the receiver operating characteristic (ROC) curve was plotted, and the area under curve (AUC), sensitivity, and specificity for malignant-benign differentiation were calculated using IBM SPSS Statistics 19.

### Results

### Lesion characteristics

This retrospective study included 879 female patients  $(46.02\pm10.60 \text{ years}; \text{ age range}, 13 \text{ to } 84)$  with 898 MRI and pathologically confirmed lesions. *Table 2* lists the BI-RADS categories of the 898 lesions included in this study. Pathologically, 472 of the 898 lesions were malignant, including not otherwise specified invasive and non-invasive

Score	Mass	NME			
MF =+1	Any 1 of the 3 descriptors:	Any 1 of the 2 descriptors:			
	(I) Spiculate or irregular margin	(I) Ductal or segmental distribution			
	(II) Irregular shape	(II) Clumped or cluster ring pattern			
	(III) Rim or heterogenous pattern				
TIC =+1	Washout	Washout or plateau			
ADC =+1	≤1.05×10 <sup>-3</sup> /cm²/s	≤1.35×10 <sup>-3</sup> /cm²/s			
Modifier =+1	High ADC (>2.0×10 <sup>-3</sup> /cm <sup>2</sup> /s,) of the enhancement lesions				
Modifier =-1	(I) EER <120% at first enhanced phase				
	(II) High signal intensity as inflow vessels or cyst on $T_2WI$				
	(III) Lower ADC at the center of rim enhancement				
	(IV) Dark septum enhancement (unenhanced septum)				

Table 1 The scoring system for mass- and NME-type lesions

NME, non-mass-enhancement; MF, morphological feature; TIC, time-intensity curve; ADC, apparent diffusion coefficient; EER, early enhancement ratio; T<sub>2</sub>WI, T<sub>2</sub>-weighted imaging.

Table 2 Dataset (898 lesions) classification based on MRI type, pathology, and BI-RADS categorization

	BI-RADS category					Tatal
Pathology	1	2	3	4	5	- Iotal
Benign						
Cyst	0	3	0	0	0	3
Adenosis	6	34	52	12	13	117
Fibroadenoma	0	25	108	19	6	158
Mastitis abscess	0	0	4	10	15	29
UDH	2	6	5	1	1	15
Risk						
ADH	0	1	2	2	8	13
Papillary lesions	0	11	18	16	42	87
Phyllodes tumors	0	0	4	0	0	4
Malignant						
IDC	2	0	2	3	367	374
ILC	0	0	0	0	2	2
MC	0	0	0	0	19	19
DCIS	1	0	0	3	73	77
Total	11	80	195	66	546	898

MRI, magnetic resonance imaging; BI-RADS, breast imaging reporting and data systems; UDH, usual ductal hyperplasia; ADH, atypical ductal hyperplasia; IDC, invasive ductal carcinoma; ILC, invasive lobular carcinoma; MC, mucinous carcinoma; DCIS, ductal carcinoma in situ.

3866



**Figure 4** ROC curves showing the diagnostic performance of BI-RADS categorization, TIC alone, and ADC alone. ROC, receiver operating characteristic; ADC, apparent diffusion coefficient; TIC, time-intensity curve; BI-RADS, breast imaging reporting and data systems.

breast carcinoma, 104 were risk, and 322 were benign. There were 66 category 4 lesions, of which 27.3% (18/66) were classified as pathological risk, 9.1% (6/66) were malignant, and 63.6% (42/66) were benign. Among the 104 pathologically borderline risk lesions, 48.1% (50/104), 17.3% (18/104), and 23.1% (24/104) were classified as category 5, 4, and 3, respectively, and the remaining 11.5% (12/104) were in category 1 or 2.

The modifiers, which are introduced in *Table 1*, can increase the diagnostic accuracy for specific diseases. In our study, without any modifiers, 22 non-puerperal mastitis cases and 68 fibroadenomas were overestimated as category 4 and category 4 or 5, respectively, while 4 mucinous carcinomas were underestimated as category 3. When the modifiers were introduced, 14 out of 29 non-puerperal mastitis cases, 68 out of 158 fibroadenomas, and 4 out of 19 mucinous carcinomas were predicted accurately in the final categorization. Non-puerperal mastitis could be easily misclassified as category 4 or 5 but could be corrected if abscess formation was observed (*Figure 3*), while other histopathological predictions, regardless of accuracy, had no influence on the final assessment.

### ROC curve analyses

The scoring of mastitis was similar to that of malignant

#### Zhong et al. A simplified BI-RADS scoring protocol

lesions in our scoring protocol, but a patient's clinical history was important for diagnosing mastitis. Because our protocol had low accuracy for diagnosing mastitis and there were few cases of mastitis in the analysis (29/898), mastitis was excluded from the ROC curve analyses. The ROC curves for BI-RADS category, TIC alone, and ADC alone are shown in *Figure 4*. The pooled AUC was 0.896 (95% CI: 0.865–0.926), 0.827 (95% CI: 0.791–0.862), and 0.419 (95% CI: 0.372–0.466) for BI-RADS category, TIC alone, and ADC alone, respectively. This simplified protocol for BI-RADS categorization, integrating MF, TIC, and ADC, had high diagnostic accuracy.

## Sensitivity, specificity, accuracy, and ROC of the protocol for BI-RADS categorization

When category 4 and 5 lesions were classified as malignant, and risk and malignant lesions were grouped together, the sensitivity, specificity, accuracy, and AUC were 92.9% (535/576), 82.3% (241/293), 89.3% (776/869), and 0.876 (95% CI: 0.847-0.904), respectively. When category 5 lesions were classified as malignant, and risk and malignant lesions were grouped together, the sensitivity, specificity, accuracy, and AUC were 88.7% (511/576), 93.2% (273/293), 90.2% (784/869), and 0.909 (95% CI: 0.887-0.932), respectively. When category 5 lesions were classified as malignant, and risk and benign lesions were grouped together, the sensitivity, specificity, accuracy, and AUC were 97.7% (461/472), 82.4% (327/397), 90.7% (788/869), and 0.900 (95% CI: 0.876-0.924), respectively. When category 4 and 5 lesions were classified as malignant, and risk and benign lesions were grouped together, the sensitivity, specificity, accuracy, and AUC were 98.9% (467/472), 69.8% (277/397), 85.6% (744/869), and 0.844 (95% CI: 0.815–0.872), respectively. Therefore, to improve the classification accuracy of borderline category 4 lesions, category 4 lesions were classified as benign lesions and only category 5 lesions were classified as malignant lesions. When risk and malignant lesions were grouped together, both the specificity (93.2% vs. 82.4%) and the AUC value (0.909 vs. 0.900) were improved compared to when the risk and benign lesions were grouped together, and the sensitivity was satisfactory. Therefore, to optimize the diagnostic efficacy, the risk lesions were grouped with the malignant lesions for traditional two-level malignant-benign differentiation. Statistical optimization was achieved when the pathological "risk + malignant" lesions-corresponding to category 5-were grouped together (Table 3; Figure 5).

Imaging prediction of malignancy	Pathological malignancy	Sensitivity	Specificity	Accuracy	AUC
Category 4 and 5	Risk and malignant lesions	92.9%	82.3%	89.3%	0.876 (0.847–0.904)
Category 5	Risk and malignant lesions	88.7%	93.2%	90.2%	0.909 (0.887–0.932)
Category 5	Malignant lesions	97.7%	82.4%	90.7%	0.900 (0.876–0.924)
Category 4 and 5	Malignant lesions	98.9%	69.8%	85.6%	0.844 (0.815–0.872)

Table 3 Sensitivity, specificity, accuracy, and AUC for the classification of category 4 lesions and the pathologically risk lesions

AUC, area under the receiver operating characteristic curve.



**Figure 5** The classification diagnostic performance of category 4 lesions and the pathologically risk lesions. (A) The distribution of category 1–5 lesions and the pathologically benign, risk, and malignant lesions. (B) With category 4 and 5 lesions classified as malignant, and risk and benign lesions grouped together. (C) With category 5 lesions classified as malignant, and risk and benign lesions grouped together. (D) With category 4 and 5 lesions classified as malignant, and risk and malignant lesions grouped together. (E) With category 5 lesions classified as malignant, and risk and malignant lesions grouped together. (E) With category 5 lesions classified as malignant, and risk and malignant lesions; N, malignant lesions; 1–5, BI-RADS 1–5; BI-RADS, breast imaging reporting and data systems.

### Zhong et al. A simplified BI-RADS scoring protocol

### Discussion

In this study, a simplified scoring protocol that used spatially matched axial T<sub>2</sub>WI, T<sub>1</sub>WI, DWI, and DCE images was proposed to improve the consistency of BI-RADS categorization. The protocol integrated MF, TIC, and ADC features with equal weights and can be used in a straightforward manner (e.g., lesions were classified as category 4 if one of those three features was suspicious, and as category 5 if any two of them were suspicious). Multiparametric MRI improved the diagnostic accuracy, which is a finding that has also been reported by some existing studies (29-31). Although protocols with more complicated logistic regression have been used in previous research (32-34), our proposed simplified and straightforward scoring system had sensitivity and specificity comparable with those reported in these earlier studies. This protocol emphasized a simplified approach, which is more convenient and practical in breast MRI reading, whereas protocols with more complicated logistic regression are more suitable for computer pattern recognition. Moreover, each image was reported via the process of composition-supervisor audit to reach a consensus on the BI-RADS category. Our simplified scoring protocol aids in converting specific imaging features into a diagnostic BI-RADS category; thus, it may help to achieve a consensus on subjective reading and BI-RADS categorization between junior doctors and senior doctors with less clinical experience. This simplified scoring protocol therefore holds promise as a helpful and practical tool for use by even the least-experienced radiologist to reduce inter-observer variability related to reader experience.

In 2013, a classification tree flowchart with 17 different variables based on a large database, later termed the Kaiser score, was introduced to help with the interpretation of enhanced breast MRI lesions (35). This classification tree includes five major diagnostic criteria: root sign, dynamic enhancement curve type, margins, internal enhancement pattern, and edema. Since its introduction in 2013, the Kaiser score has been reported to have high diagnostic accuracy for the differential diagnosis of benign and malignant lesions in a variety of selected patient populations (36-40). However, the Kaiser score does not include quantitative MRI techniques, such as DWI or quantitative DCE, and it is not associated with the BI-RADS lexicon. Moreover, the Kaiser score, which includes 17 variables, still requires further simplification for easy clinical application. In this study, a simplified scoring protocol was proposed for

BI-RADS categorization based on dynamic protocols and quantitative techniques to improve diagnostic accuracy.

Our study also investigated the borderline effect of pathological risk and category 4 lesions. The sensitivity and specificity, reported from traditional two-scale differentiation between malignant and benign lesions, varied considerably. Possible reasons for this variation included whether the risk lesions were classified together with malignant or benign lesions and the classification of category 4 risk lesions (as malignant or benign) (41). Our results showed that when the risk lesions were classified together with malignant lesions, the AUC value improved. This result shows that the MF, TIC, and ADC of risk lesions showed greater similarity with features of malignant lesions than benign lesions. This finding also supports the current recommendation that patients exhibiting risk lesions should undergo surgical excision or, at the least, be closely followed up (42,43), due to their potential for malignancy. Grouping category 4 lesions together with malignant or benign lesions has a direct impact on the BI-RADS categorization; therefore, category 4 lesions should be treated with extreme caution. Our results showed that only 17.3% (18/104) of lesions were classified as category 4. When category 4 and 5 lesions were classified as malignant, the sensitivity, specificity, accuracy, and ROC all decreased. Therefore, to improve the diagnostic accuracy of the protocol for BI-RADS categorization, only category 5 lesions should be treated as malignant lesions. Ideally, threelevel differentiation is recommended, with malignant, risk, and benign lesions corresponding to category 5, category 4, and category 3 or lower, respectively. The management of category 4 lesions depends on localization-if the lesions are local, then a biopsy is recommended; otherwise, a shortterm follow-up should be suggested (44).

Another advantage of our proposed simplified protocol is that we acquired isotropic, high spatial resolution images, with a DCE sequence at  $1 \text{ mm} \times 1 \text{ mm} \times 1 \text{ mm}$ . Such high spatial resolution was sufficient for providing finer structural details, such as a spiculated margin and cluster-ring patterns, and at the same time preserved the TIC information without compromising the kinetic curve profile. Our study also showed that the MF should be evaluated on the first passage of the DCE scan in the three orthogonal views (axial, sagittal, and coronal) (45,46). The complementary but delayed sagittal or coronal scan was not chosen, as such a delay might enhance BPE (47), which may obscure the lesions and in turn lead to imaging misinterpretation and, ultimately, underestimation or

overestimation of lesions, or even missing them altogether (48-50). The isotropic acquisition was set to a resolution that allows three orthogonal views to be acquired in the same phase by multiplanar reconstruction or maximum intensity projection processing in a fast manner. Therefore, the examination time was shortened and better patient cooperation could be achieved.

Our study has potential limitations. First, only histopathologically verified lesions were considered, thus potentially biasing our lesion database toward more complex cases for which invasive diagnosis was requested in the first place. However, we included only these lesions so as to provide a more accurate reference standard. Second, according to the Centre for Evidence-Based Medicine reasoning, our simplified scoring protocol was exploratory. To achieve a high level of diagnostic accuracy, a validation study in a single clinical center is required. We expect other research centers to validate our protocol. Furthermore, our study was retrospective and included ahigh ratio of malignant to benign lesions. Therefore, prospective studies are needed to confirm the validity of breast MRI and our score in this setting. Third, our study was performed considering only MRI features and did not integrate patient characteristics.

### Conclusions

Our simplified scoring protocol integrates MF, TIC, and ADC values with equal weights to improve the consistency of BI-RADS categorization, diagnostic performance in the clinical practice, and the understanding of benign, risk, and malignant breast diseases.

### **Acknowledgments**

Funding: None.

### Footnote

*Reporting Checklist:* The authors have completed the STARD reporting checklist. Available at https://qims.amegroups.com/article/view/10.21037/qims-21-1036/rc

*Conflicts of Interest:* All authors have completed the ICMJE uniform disclosure form (available at https://qims.amegroups.com/article/view/10.21037/qims-21-1036/coif). The authors have no conflicts of interest to declare.

Ethical Statement: The authors are accountable for all

aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved. The study was conducted in accordance with the Declaration of Helsinki (as revised in 2013). The study was approved by the Ethics Committee of Chinese People's Liberation Army General Hospital (No. S2019-093-01), and individual consent for this retrospective analysis was waived.

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### 3870

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**Cite this article as:** Zhong Y, Li M, Zhu J, Zhang B, Liu M, Wang Z, Wang J, Zheng Y, Cheng L, Li X. A simplified scoring protocol to improve diagnostic accuracy with the breast imaging reporting and data system in breast magnetic resonance imaging. Quant Imaging Med Surg 2022;12(7):3860-3872. doi: 10.21037/qims-21-1036

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