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The application of apparent diffusion coefficients derived from intratumoral and peritumoral zones for assessing pathologic prognostic factors in rectal cancer

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Abstract

Objective To investigate the diagnostic performance of the apparent diffusion coefficient (ADC) derived from intratumoral and peritumoral zones for assessing pathologic prognostic factors in rectal cancer.

Materials and methods One hundred forty-six patients with rectal cancer who underwent preoperative MRI were prospectively enrolled. Two radiologists independently placed free-hand regions of interest (ROIs) in the largest tumor cross section and three small ROIs on the peritumoral zone adjacent to the tumor contour. Maximum values of tumor ADC (ADC_{max}), minimum values of tumor ADC (ADC_{tmin}), mean values of tumor ADC (ADC_{tmean}), mean values of peritumor ADC (ADC_{pmean}), and ADC_{pmean} ADC_{tmean} (ADC ratio) were obtained on ADC maps and correlated with prognostic factors using uni- and multivariate logistic regression, and receiver operating characteristic curve (ROC) analysis.

Results Interobserver agreement was excellent for ADC_{tmax} and ADC_{tmean} (intraclass correlation coefficient [ICC], 0.915– 0.958), and were good for ADC_{tmin} , ADC_{pmean} , and ADC ratio (ICC, 0.774–0.878). The ADC ratio was significantly higher in the poor differentiation, T3–4 stage, lymph node metastasis (LNM)–positive, extranodal extension (ENE)–positive, tumor deposit (TD)–positive, and lymphovascular invasion (LVI)–positive groups than that in the well–moderate differentiation, T1–2 stage, LNM-negative, ENE-negative, TD-negative, and LVI-negative groups $(p = 0.008, < 0.001, < 0.001, 0.001, < 0.001,$ and < 0.001, respectively). The area under the ROC curve (AUC) of the ADC ratio was the highest for assessing poor differentiation (0.700) , T3–4 stage (0.707) , LNM-positive (0.776) , TD-positive (0.848) , and LVI-positive (0.778) . Both the ADC ratio (AUC = 0.677) and ADC_{pmean} (AUC = 0.686) showed higher diagnostic performance for assessing ENE.

Conclusion The ADC ratio could provide better predictive performance for assessing preoperative prognostic factors in resectable rectal cancer.

Key Points

- Both the peritumor/tumor ADC ratio and ADC_{pmean} are correlated with important prognostic factors of resectable rectal cancer.
- Both peritumor ADC and peritumor/tumor ADC ratio had higher diagnostic performance than tumor ADC for assessment of prognostic factors in resectable rectal cancer.
- Peritumor/tumor ADC ratio showed the most capability for the assessment of prognostic factors in resectable rectal cancer.

Keywords Rectal neoplasms . Diffusion magnetic resonance imaging . Lymphatic metastasis . Extranodal extension

Introduction

Colorectal cancer has become the third most frequent malignancy in the world [\[1\]](#page-11-0). Its prognosis depends on different factors, such as poor differentiation, deep tumor invasion, and lymphovascular invasion (LVI) [[2](#page-11-0), [3\]](#page-11-0). Moreover, lymph node metastasis (LNM) and tumor deposits (TDs), which are both recognized as N staging elements of the 8th Tumor Node Metastasis (TNM) staging system [\[4\]](#page-11-0), play an important role in determining the therapeutic strategy [\[5](#page-11-0)–[7](#page-11-0)]. Extranodal extension (ENE), defined as the extension of tumor cells through the nodal capsule into the perinodal fatty tissue, is an important prognostic factor in patients with several types of malignancies [\[4](#page-11-0)]. Although ENE in patients with rectal cancer is not yet considered the TNM staging system, several studies have reported that ENE is an adverse prognostic factor $[8-10]$ $[8-10]$ $[8-10]$ $[8-10]$. Therefore, accurate preoperative assessments of these prognostic factors are important for improving the prognosis of this disease.

As a noninvasive imaging modality with no ionizing radiation and excellent soft-tissue contrast, MRI has been widely implemented for prognostic assessment of rectal cancer. The traditional morphological signs were applied to evaluate the T category, anal sphincter complex involvement, mesorectal fascia involvement, and extramural vascular invasion of rectal cancer [[11\]](#page-11-0). However, defining LNM and TD remains challenging by using size criteria and morphological criteria [\[12](#page-11-0), [13](#page-11-0)]. Moreover, tumor differentiation, LVI, and ENE can only be determined by the postoperative pathological examination. Diffusionweighted imaging (DWI) is a functional technique that provides information about water mobility, tissue cellularity, and the integrity of the cellular membrane. The apparent diffusion coefficient (ADC) value is used to quantify water diffusion, which provides an estimation of tumor heterogeneity [[14](#page-11-0)]. However, tumor heterogeneity is not only solely limited to cancer cells but also relates to nonmalignant and infiltrating cells surrounding the tumor, commonly referred to as the microenvironment. The role of the tumor environment is important because it is the interaction between tumor cells and the surrounding microenvironment that influences tumor evolution and progression [[15\]](#page-11-0). Previous studies have confirmed that peritumoral regions surrounding tumors contain valuable information in cancer studies of breast [[16\]](#page-11-0), esophageal [\[17](#page-11-0)], and endometrial cancer [\[18](#page-11-0)]. Although several studies have reported associations between intratumoral ADC values and prognostic factors of rectal cancer, peritumoral ADC values have not been reported [[19](#page-11-0), [20](#page-11-0)]. Therefore, the purpose of this study was to explore the diagnostic value of the ADC value of the intratumoral and peritumoral zones for the assessment of prognostic factors in resectable rectal cancer.

Materials and methods

Study population

Our institutional review board approved this prospective study, and all study participants provided informed consent. A total of 204 consecutive patients (mean age \pm SD, 62 \pm 11.4 years old, with a range from 24 to 88 years) with resectable rectal cancer who underwent radical surgery between January 2017 and March 2021 were enrolled in this study. The inclusion criteria were nonmucinous rectal adenocarcinoma proven by endoscopic biopsy. The exclusion criteria were as follows: (1) tumors were not visible on MR images $(n = 6)$; (2) insufficient image quality due to gas-induced susceptibility artifacts or movement artifacts $(n = 8)$; (3) any contraindication for surgery $(n = 2)$; (4) nonresectable and/or metastatic disease $(n = 36)$; and (5) presence of mucinous tumors, which have a very low cellular density and will therefore exhibit high ADC values ($n = 6$).

Imaging protocol

MRI was performed using a 1.5-T scanner (MAGNETOM Aera, Siemens Healthineers) with body coils. Patients were given 20 mg of scopolamine butylbromide (Buscopan, Boehringer Ingelheim) intramuscularly 30 min before MRI to reduce bowel motion. Patients did not receive rectal distention before MR examinations. The conventional MRI protocol included sagittal, axial (perpendicular to the long axis of the rectum), oblique coronal T2-weighted images, and no fat saturation and DWI (perpendicular to the long axis of the rectum). The acquisition parameters for T2-weighted images were as follows: TR/TE, 4590/73; field of view, 220 mm²; matrix size, 256×512 ; section thickness, 3.5 mm; and intersection gap, 0.7 mm. Axial DW images of the pelvis were obtained with the following parameters: 4600/59; number of signals acquired, eight; field of view, 360 mm²; section thickness, 5 mm; and b values, 0 and 800 s/mm². ADC maps were created automatically by the device.

Image analysis

The MRI images were independently reviewed by the two radiologists (Y.Y. and H.L., 4 and 10 years of experience in reading rectal MRI) who were blinded to the patients' clinical and pathological information but were aware that the patients had been

Fig. 1 Methods used to measure the tumor and peritumor apparent diffusion coefficient (ADC) values. A–C A 61-year-old man with T3N2M0, extranodal extension (ENE)–positive, tumor deposit (TD)– positive, lymphovascular invasion (LVI)–positive, and poorly differentiated rectal cancer. Regarding the tumor ADC, the slice with the largest tumor cross section was selected, and the region of interest (ROI) was placed inside the tumor that contained the largest tumor area with reference to (A) T2WI imaging and (B) DWI. ADC_{tmax}, ADC_{tmin}, and ADC_{tmean} are recorded as 0.919×10^{-3} mm²/s, 0.668×10^{-3} mm²/s, and 0.833×10^{-3} mm²/s, respectively. For the peritumoral ADC, three elliptical ROIs were drawn along the tumor margin where the ADC

diagnosed with rectal cancer. To measure the ADC of the tumor, the largest tumor cross section was selected on the ADC map. Regions of interest (ROIs) were applied to intratumoral and peritumoral zones (Fig. 1). The radiologists reviewed the T2WI and DWI images and determined the location of the tumor. According to the previous method described by Mori et al [\[16\]](#page-11-0), three elliptical ROIs (mean area, 20 mm^2) were then drawn along the tumor margin where the ADC values visually appeared to be most increased on the peritumoral zone for measuring the ADC values of the individual ROIs: the maximum mean values of these ADC were designated as the peritumoral ADC (ADCpmean). For intratumoral ADC measurements, ROIs were placed inside the tumor that contained the largest tumor area, while cystic, necrotic, and visible vascular structures were carefully avoided by referring to T2-weighted images. Maximum, minimum, and mean values of intratumoral ADC were recorded and designated as ADC_{tmax} , ADC_{tmin} , and ADC_{tmean} , respectively. The peritumor-tumor ADC ratio was calculated according to the following formula: ADC ratio= $ADC_{\text{pmean}}/ADC_{\text{tmean}}$.

Surgical histologic findings

All patients underwent radical total mesorectal excision, indicating that the entire mesorectal fat, including all lymph nodes, should be excised. At least 12 regional lymph nodes

values visually appeared to be most increased in the (C) peritumoral zone. The maximum mean value of the three ADC values was designated as the peritumoral ADC (ADC_{pmean}). The ADC_{pmean} and ADC ratio are 2.033×10^{-3} mm²/s and 2.441, respectively. D–F A 65year-old woman with T3N1M0, extranodal extension (ENE)–negative, tumor deposit (TD)–negative, lymphovascular invasion (LVI)–negative, and moderate differentiation rectal cancer. The ADC_{tmax}, ADC_{tmin}, ADC_{pmean}, and ADC ratio were recorded as 1.124×10^{-3} mm²/s, 0.690×10^{-3} mm²/s, 0.891×10^{-3} mm²/s, 1.649×10^{-3} mm²/s, and 1.851, respectively

should be examined. A specialist with 13 years of experience in rectal pathology examined operative specimens and reported the histopathologic findings according to the College of American Pathologists guidelines. ENE was defined as cancer cells infiltrating the extranodal adipose tissue extending through or beyond the lymph node capsule according to a previous study [[21](#page-11-0)]. Histology type, depth of tumor invasion, lymph node status, ENE, TD, and LVI were reported.

Statistical analysis

The statistical analyses were performed using SPSS version 22 (IBM Corporation) and MedCalc (Version 16.8). The intraclass correlation coefficients (ICCs) were calculated by a two-way mixed model with absolute agreement to evaluate the agreement between the ADC values measured by the two radiologists. Twenty-three patients were randomly selected for ICC. The ICC was classified into poor (ICC < 0.5), moderate (0.5 \leq ICC < 0.75), good (0.75 \leq ICC < 0.9), and excellent (ICC \geq 0.9) [\[22\]](#page-11-0). The interradiologist measurements for ADC values were further compared using Bland-Altman plots to examine bias and limits of agreement [\[23\]](#page-11-0). The mean difference and the 95% limits of agreement (mean difference \pm 1.96 standard deviations [SDs]) are illustrated. The ADC values were averaged between the two radiologists for further

Fig. 2 Flow diagram shows the inclusion and exclusion criteria for the study

analysis. As parameters were normally distributed, Student's t tests and one-way ANOVA were used to compare statistical difference in different groups. As parameters were not normally distributed, Mann-Whitney U test and Kruskal-Wallis H test were used for comparisons of different groups. Univariate and multivariate logistic regression analyses were sequentially performed among ADC values to screen out the independent risk factors for tumor differentiation, T classification, LNM, ENE, TD, and LVI. The factors with a p value \lt 0.05 during multivariate logistic regression were determined to be independent risk factors. Optimal cutoffs for each ADC parameter were determined at points that maximized Youden's J index based on receiver operating characteristic (ROC) curves. Youden's index is calculated by specificity + sensitivity − 1 [[24](#page-11-0)]. Two-sided $p < 0.05$ represents statistical significance among all statistics.

Results

Relationship between clinicopathologic characteristics and ADC parameters

The remaining 146 patients (mean age \pm SD, 64 \pm 11.6 years old; range 26–88 years) constituted the population of the current study (Fig. 2). The results of correlations between clinical characteristics and ADC parameters are shown in Table [1.](#page-4-0) The results of correlations between prognostic factors and ADC parameters are shown in Table [2](#page-5-0) and Fig. [3.](#page-6-0) The values of ADC_{tmin} and ADC_{tmean} were larger in the T1–2 classification, LNM-negative, TD-negative, and LVI-negative groups than those in the T3–4 classification, LNM-positive, TD-positive, and LVI-positive groups, respectively ($p \le 0.001 - 0.044$). However, the value of ADC_{tmin} was larger in the ENEnegative group than in the ENE-positive group ($p = 0.017$). The values of ADC_{pmean} and ADC ratio were smaller in the tumor with well–moderate differentiation, T1–2 classification, LNM-negative, ENE-negative, TD-negative, and LVInegative groups than those in the tumor with poor differentiation, T3–4 classification, LNM-positive, ENE-positive, TDpositive, and LVI-positive groups, respectively ($p \leq 0.001-$ 0.011).

Univariate and multivariate analysis

The univariate and multivariate logistic regression results for screening out the independent risk factors for prognosis are summarized in Table [3](#page-7-0). The ADC ratio was an independent risk factor for histology type (odds ratio [OR] with 95% confidence interval [CI], 7.008 [95% CI: 1.757–27.954]; $p =$ 0.006). T classification, ADC_{tmin} , ADC_{tmean} , and ADC ratio were independent risk factors for predicting LNM (OR with 95% CI, 1.713 [95% CI: 1.041–2.817], 0.619 [95% CI: 0.480–0.799], 1.391 [95% CI: 1.197–1.616], and 1.290 [95%CI: 1.145–1.454]; $p = 0.030$, < 0.001, < 0.001, and < 0.001 , respectively). T classification, ADC_{tmin}, ADC_{pmean}, and ADC ratio were independent risk factors for predicting ENE (OR with 95% CI, 1.780 [95% CI: 1.001–3.293], 0.689

 $\mathrm{ADC}_{\mathrm{mean}}$

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[95% CI: 0.507 –0.935], 1.246 [95% CI: 1.059 –1.465], and 1.104 [95% CI: 1.000–1.220]; $p = 0.04, 0.017, < 0.001$, and 0.032, respectively). T classification, histological type, ADC_{pmean}, and ADC ratio were independent risk factors for predicting TD (OR with 95% CI, 2.134 [95% CI: 1.072 – 4.245], 6.957 [95% CI: 1.605 –30.159], 1.556 [95%CI: 1.273–1.901], and 1.437 [95%CI: 1.236–1.670]; $p = 0.031$, 0.01 , < 0.001 , and < 0.001 , respectively). ADC_{tmin}, ADC_{pmean}, and ADC ratio were independent risk factors for predicting LVI (OR with 95%CI, 0.686 [95%CI: 0.531 – 0.886], 1.313 [95%CI: 1.126 –1.530], and 1.207 [95%CI: 1.072–1.360]; $p = 0.004, 0.011$, and 0.002, respectively).

Diagnostic performance of ADC parameters for assessment of clinicopathological characteristics

As illustrated in Table [4](#page-8-0) and Fig. [4,](#page-9-0) the difference in AUC between the ADC ratio and ADC_{pmean} was not significant in distinguishing tumor differentiation (AUC, 0.700 vs. 0.664, $p = 0.336$. The AUCs of 0.707, 0.663, 0.622, and 0.614 for the ADC ratio, ADC_{pmean} , ADC_{tmean} , and ADC_{tmin} were not significantly different from each other in distinguishing T classification ($p = 0.098 - 0.586$). The AUC was greater for the ADC ratio than for the ADC_{tmean} $(0.776 \text{ vs. } 0.621, p = 0.001)$ for predicting LNM. However, the AUC for ADC ratio was not significantly greater than either ADC_{tmin} (0.776 vs. 0.697, $p = 0.115$) or ADC_{pmean} (0.776 vs. 0.748, $p = 0.320$) for predicting LNM. The AUCs of 0.686, 0.677, and 0.625 for ADC_{pmean} , ADC ratio, and ADC $_{tmin}$ were not significantly different from each other for assessing ENE ($p =$ 0.420 –0.782). For predicting TD and LVI, the AUC for ADC ratio was significantly better compared with either ADC_{tmin} (0.848 vs. 0.635, $p < 0.001$; 0.778 vs. 0.656, $p =$ 0.004, respectively) or ADC_{tmean} (0.848 vs. 0.682, p < 0.001; 0.778 vs. 0.636, $p = 0.002$, respectively), but there were no significant differences between ADC ratio and ADC_{pmean} (0.848 vs. 0.819, $p = 0.362$; 0.778 vs. 0.735, $p = 0.245$, respectively).

Interobserver agreement of ADC parameters

Interobserver agreement was excellent for ADC_{tmax} (intraclass correlation coefficient [ICC], 0.915; 95% CI, 0.811 –0.963) and ADC_{tmean} (ICC, 0.958; 95% CI, 0.903-0.982). Interobserver agreement was good for ADC_{tmin} (ICC, 0.844; 95% CI, 0.668–0.931), ADC_{pmean} (ICC, 0.774; 95% CI, 0.538 –0.898), and ADC ratio (ICC, 0.878; 95% CI, 0.713 – 0.948).

The Bland-Altman plots representing the relationship between the differences and mean ADC values determined by the two radiologists are illustrated in Fig. 5 . For ADC_{tmin}, the mean difference and 95% limits of agreement were 0.02 mm^2 /

ADC_{pmean}/ADC_{unean}; LNM, lymph node metastasis; ENE, extranodal extension; TD, tumor deposit; LVI, lymphovascular invasion

s and -0.18 to $+0.23$ mm²/s, respectively; for ADC_{tmax}, the mean difference and 95% limits of agreement were −0.02 mm²/s and -0.28 to $+0.24$ mm²/s, respectively; for ADC_{tmean} , the mean difference and 95% limits of agreement were -0.01 mm²/s and -0.1 to $+0.08$ mm²/s, respectively; for ADC_{pmean}, the mean difference and 95% limits of agreement were 0.00 mm^2 /s and $-0.37 \text{ to } +0.37 \text{ mm}^2$ /s, respectively; for ADC ratio, the mean difference and 95% limits of agreement were 0.03 and −0.19 to +0.25, respectively. Overall, there was good agreement for all ADC values measured by the two radiologists, and the majority of points fell within the 95% limits of agreement range.

Discussion

In this study, we evaluated the diagnostic performance of ADC parameters derived from the intratumoral and peritumoral zones for assessing prognostic factors in resectable rectal cancer. Our study demonstrated that the ADC value of the peritumoral zone, especially the peritumor-tumor ADC ratio, could be potentially useful for evaluating prognostic factors. However, the ADC values of the tumor were not reliable enough.

A previous study addressed the diagnostic performance of tumor ADC for assessing prognostic factors in rectal cancer and indicated conflicting results. Li et al reported that the

maximum ADC value obtained with several small ROIs could not differentiate the histologic type, but it provided valuable diagnostic performance for assessing the LVI and N stage [\[20](#page-11-0)]. Our study indicated that the maximum ADC value obtained by drawing the largest tumor area ROI could not be used to assess prognostic factors. Possible reasons for these inconsistent outcomes included the different ROI delineations and large sample size in our study. Liu et al showed that the ADC_{tmean} and ADC_{tmin} obtained by drawing the whole tumor ROIs could differentiate histological grade [[19](#page-11-0)]. Curvo-Semedo et al also found that the ADC_{tmean} obtained by selecting smaller round/oval-shaped ROIs could differentiate histological type [\[25\]](#page-11-0). However, Sun et al reported that the ADC_{tmean} value obtained by drawing three ROIs as large as possible could not be used to differentiate histology type [[26\]](#page-11-0). Our study showed that the ADC_{tmean} and ADC_{tmin} values could not differentiate histology type. The explanation of these different outcomes could be that we combined well differentiation and moderate differentiation as well–moderate differentiation for statistical analysis because of the small sample size for well differentiation. Moreover, the different methods of ROI delineation and the choice of different b values may result in these differences. Regarding the assessment of the other prognostic factors, both the ADC_{tmean} and ADC_{tmin} values could assess T classification, LNM, and extramural vascular invasion but with lower diagnostic performance $[19]$ $[19]$. Our results also indicated that ADC_{tmean} and

Fig. 3 Box plots show the association of ADC_{tmax} , ADC_{tmin} , ADC_{tmean} , ADC_{tmean} , and ADC ratio with prognostic factors in rectal cancer

Table 3 Univariate and multivariate analyses of risk factors for prognostic factors

Note: ADC, apparent diffusion coefficient; ADC_{tmin}, ADC_{tmean}, ADC_{tmax}, minimum, mean, and maximum values of tumor ADC, respectively; ADC_{pmean} , mean values of peritumor ADC; ADC ratio, ADC_{pmean}/ADC_{tmean}; LNM, lymph node metastasis; ENE, extranodal extension; TD, tumor deposit; LVI, lymphovascular invasion. *Data are statistically significant results from logistic regression analysis

 ADC_{tmin} could assess T classification, LNM, ENE, TD, and LVI, although the diagnostic performance was low. Therefore, these conflicting results and the lower diagnostic performance may indicate that the ADC value derived from the intratumoral zone is not sufficient for improving the diagnostic accuracy.

A previous study reported that the heterogeneity of the peritumoral environment has its own spatial and temporal hierarchical order, which can interact with the tumor to modulate signaling pathways and growth. Thus, it has emerged as a promising field for improving diagnosis and treatment. They concluded that extramural venous

invasion scores obtained on imaging were positively correlated with heterogeneity in the peritumoral tissue of rectal cancer [[27\]](#page-11-0). Chen et al also reported that the combination of tumor and peritumoral US radiomics may provide a more comprehensive understanding of tumor invasion of rectal cancer [[28](#page-12-0)]. In this study, we evaluated the associations of the ADC value for peritumoral areas and the peritumor/tumor ADC ratio with prognostic factors. We found that a higher peritumor/tumor ADC ratio and ADC_{pmean} were associated with a higher tumor differentiation grade, higher T classification, and the presence of LNM, ENE, TD, and LVI. A previous study in breast cancer reported tumors with higher histological grades, and more metastatic lymph nodes are known to be associated with peritumoral edema caused by LVI [[29,](#page-12-0) [30](#page-12-0)]. Our study indicated that both peritumor ADC values and

peritumor/tumor ADC ratios were independent risk factors for assessing LVI. Therefore, we may presume that the presence of peritumoral edema would cause higher peritumor ADC values and result in a higher peritumor/tumor ADC ratio. We further found that ADC_{pmean} and peritumor/tumor ADC ratio had higher diagnostic performance than ADC values alone from the tumor for assessing prognostic factors. Most importantly, the peritumor/tumor ADC ratio indicated higher interobserver agreement than ADC_{pmean} and showed even better diagnostic ability to assess prognostic factors, although there were no significant differences for the AUC. The explanation could be that lower tumor ADC and higher peritumoral ADC, unsurprisingly, led to higher peritumortumor ADC ratios in the poor differentiation, T3–4 classification, LNM-positive, ENE-positive, TD-positive, and LVIpositive groups than well–moderate differentiation, T1–2

Table 4 Diagnostic performance for ADC parameters in discrimination of clinicopathologic characteristics of rectal cancer

Note: ADC, apparent diffusion coefficient; ADC_{min} , $ADC_{t_{mean}}$, $ADC_{t_{max}}$, minimum, mean, and maximum values of tumor ADC, respectively; ADC_{pmean} , mean values of peritumor ADC; ADC ratio, ADC_{pmean}; LNM , lymph node metastasis; ENE, extranodal extension; TD, tumor deposit; LVI, lymphovascular invasion

Fig. 4 Receiver operating characteristic curves. A Differentiation of well–moderate from poor differentiation with ADC_{pmean} (blue line) and ADC_{pmean}/ADC_{temean} (ADC ratio) (red line). **B** Differentiation of T1–2 from T3-4 with minimum values of tumor ADC (ADC_{tmin}) (yellow line), ADC_{tmean} (purple line), ADC_{pmean} (blue line), and ADC ratio (red line). C Differentiation of lymph node metastasis (LNM)-negative from LNMpositive with ADC_{tmin} (yellow line), ADC_{tmean} (purple line), ADC_{pmean} (blue line), and ADC ratio (red line). D Differentiation of extranodal

extension (ENE)–negative from ENE-positive with ADC_{min} (yellow line), ADC_{pmean} (blue line), and ADC ratio (red line). E Differentiation of tumor deposit (TD)–negative from TD-positive with ADC_{tmin} (yellow line), ADC_{tmean} (purple line), ADC_{pmean} (blue line), and ADC ratio (red line). F Differentiation of lymphovascular invasion (LVI)–negative from LVI-positive with ADC_{tmin} (yellow line), ADC_{tmean} (purple line), ADCpmean (blue line) and ADC ratio (red line)

classification, LNM-negative, ENE-egative, TD-negative, and LVI-negative groups.

To our knowledge, no relationship between peritumorrelated ADC values and prognostic factors has been reported in rectal cancer. ADC is a theoretically absolute value and can be confounded by several factors, such as different field strengths or manufacturers of the MRI scanners used, bvalues, and ROI size [[31](#page-12-0)]. The peritumor/tumor ADC ratio, which is a relative value of ADC_{pmean} and ADC_{tmean} , is more reliable and generally more applicable than the ADC value alone measured on the tumor or peritumoral area. Moreover, a previous study reported that only three small ROIs obtained by the visual assessment ROI method were sufficient to identify the needed values in breast cancer [[32\]](#page-12-0). Therefore, to minimize the effects of these factors that confound DWI, three small ROIs were drawn on the peritumoral area where the ADC value appeared to be most increased adjacent to the tumor border. Nevertheless, further studies are needed to ensure the utility of the peritumor/tumor ADC ratio in the assessment of prognostic factors in different MRI systems or bvalues and ROI sizes.

Our study has several limitations. First, we combined well differentiated and moderately differentiated tumors because there were only 5 patients with well differentiated tumors. Therefore, a much larger sample size is needed to evaluate histological type in rectal cancer. Second, this is a singleinstitution study without a validation cohort, and whether our results can be confirmed in other medical institutions must be assessed in future studies. Third, ADC values were obtained by the single slice ROIs that contained the largest tumor area, which might be not representative of the overall tumor profile. However, considering the measurement time, reproducibility, and diagnostic ability, the single slice ROI method is potentially useful for clinical practice. Finally, the prognostic significance of peritumor ADC values should be investigated in prospective studies with much larger cohorts, which is beyond the scope of this study.

In conclusion, ADC values derived from intratumoral and peritumoral zones could be used to assess preoperative prognostic factors in resectable rectal cancer. Among all kinds of ADC parameters, the ADC ratio could properly provide better predictive performance.

Fig. 5 Bland-Altman plots of interobserver agreement for different ADC measurements. Bland-Altman plots of ADC_{tmin} (a), ADC_{tmax} (b), ADC_{tmean} (c), ADC_{pmean} (d), and ADC ratio (e). The difference (y-axis) between the two observers is plotted against the mean value $(x\text{-axis})$ of the

two radiologists' measurements. The solid horizontal blue line indicates the mean difference. The upper and lower dashed lines correspond to upper and lower 95% limits of agreement, which are calculated as the mean \pm 1.96 standard deviation (SD)

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Declarations

Guarantor The scientific guarantor of this publication is Hang Li.

Conflict of interest The authors of this manuscript declare that Siyun Liu is a statistician from GE Healthcare and controls of the study data. The other authors declare no competing interests.

Statistics and biometry Siyun Liu and Zhenlin Li kindly provided statistical advice for this manuscript.

Informed consent Written informed consent was obtained from all subjects (patients) in this study.

Ethical approval Institutional Review Board approval was obtained.

Methodology

- prospective
- diagnostic or prognostic study
- performed at one institution

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