UROLOGY - ORIGINAL PAPER



Predicting side-specific prostate cancer extracapsular extension: a simple decision rule of PSA, biopsy, and MRI parameters

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Abstract

Objective To develop an easy-to-use side-specific tool for the prediction of prostate cancer extracapsular extension (ECE) using clinical, biopsy, and MRI parameters.

Materials and methods Retrospective analysis of patients who underwent radical prostatectomy preceded by staging multiparametric MRI of the prostate was performed. Multivariate logistic regression analysis was used to choose independent predictors of ECE. Continuous variables were transformed to categorical ones by choosing threshold values using spline knots or testing thresholds used in previously described models. Internal validation of the rule was carried out as well as validation of other algorithms on our group was performed.

Results In the analyzed period of time, 88 out of 164 patients who underwent radical prostatectomy met inclusion criteria. ECE was evidenced at radical prostatectomy in 41 patients (46.6%) and in 53 lobes (30.1%). In the multivariate analysis PSA, total percentage of cancerous tissue in cores (%PCa) and maximum tumour diameter (MTD) of Likert 3–5 lesions on MRI were independent predictors of ECE. The following rule for predicting side-specific ECE was proposed: %PCa \geq 15% OR MTD \geq 15 mm OR PSA \geq 20 ng/mL. Internal validation of the algorithm revealed safe lower confidence limits for sensitivity and NPV, proving that model offers accurate risk grouping that can be safely used in decision-making.

Conclusion The rule developed in this study makes ECE prediction fast, intuitive, and side-specific. However, until validated externally it should be used with caution.

 $\textbf{Keywords} \ \ \text{Extracapsular extension} \cdot \text{Locally advanced prostate cancer} \cdot \text{Multiparametric magnetic resonance imaging} \cdot \text{Nomogram} \cdot \text{Predictive model} \cdot \text{Prognostic tool}$

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Introduction

Radical prostatectomy (RP) is associated with excellent cancer-specific survival rates and constitutes one of the two curative standards in patients with organ-confined prostate cancer (PCa). Nerve-sparing technique significantly improves postoperative continence and potency. However, in patients with extracapsular extension (ECE), nerve-sparing RP bears risk of positive surgical margins (PSM). ECE is found in 27–36% men of current RP series [1–6]. However, unilateral ECE is much more common than bilateral, thus one side NVB preservation should be possible in at least 80% patients [1, 5, 6], provided that information on this fact is available before surgery. For these reasons, accurate, sidespecific preoperative ECE prediction is necessary. Utilising biopsy and clinical parameters, a number of tools for ECE prediction has been developed and successfully validated



[2, 5–7]. Simultaneously, the role of multiparametric magnetic resonance imaging (MP-MRI) has increased in preoperative staging [3]. Radiological assessment of ECE is, however, challenged by poorly distinguished direct signs of ECE. Instead, indirect parameters such as capsule bulging, lesion size, or area of the lesion adhering to the capsule have been shown to have higher accuracy. Despite standardization [8, 9], the role of experience cannot be overestimated [10]. New predictive tools are being developed incorporating MRI-based parameters into models [4, 11, 12]. Apart from accuracy, the ideal tools should be characterized by simplicity and prostate side-specificity. Several previous studies suggested that maximum tumour diameter (MTD) might be used in predicting ECE [13]. Since, according to ESUR guidelines, MTD should be reported during every MP-MRI evaluation [9], its radiologic measurement can be easily implemented in preoperative assessment. Herein we developed an easy-to-use side-specific tool for the prediction of ECE based on basic clinical, biopsy, and MP-MRI parameters.

Materials and methods

Patients

Patients who underwent radical prostatectomy preceded by MP-MRI for staging in years 2012-2014 were included into this retrospective analysis. The study was approved by institutional review board. MP-MRI was scheduled in all patients operated at that time in our department. Both urologists and radiologists in our institution were starting getting experience in this imaging technique then. In all cases, PCa was detected with transrectal ultrasound-guided biopsy. None of the patients received androgen deprivation therapy or radiotherapy before surgery. Other exclusion criteria were: distant metastases, transurethral resection of the prostate, technical issues preventing the MRI interpretation, incomplete postprostatectomy pathological report, or lack of report from prostate biopsy. The following clinical variables were identified from medical files: age, clinical tumour stage, serum total prostate-specific antigen (PSA), prostate volume, and PSA density (PSAD). For each lobe of the prostate number of positive cores, percentage of positive cores, percentage of cancer in total biopsy specimen, and Gleason score were identified separately. If no cancer was found in the lobe at biopsy, all biopsy-derived variables for this side were counted as zero. For RP specimen Gleason score, surgical margins status and pathological stage were reported for each side separately. All prostate specimens were analyzed according to the International Society of Urological Pathology guidelines (2005) and the TNM classification.



Staging MP-MRI was performed on a 1.5-T magnetic resonance system (Ingenia; Philips Healthcare, Best, The Netherlands) characterized by direct digital data sampling using a multichannel phased-array coil and an endorectal coil filled with air. Examinations consisted of T2-weighted MRI, DWI, and dynamic contrast-enhanced imaging (DCE-MRI) was carried out according to the ESUR guidelines always more than 4 weeks after biopsy. Examinations were evaluated by a single radiologist with limited experience in prostate MRI at the beginning of the study, while being aware of clinical patient data. The Prostate Imaging Reporting And Data System (PI-RADS) was used to assess lesions [8]. Every lesion was scored on a 1-to-5-point scale for T2-weighted MRI, DWI, and DCE-MRI separately. Subsequently, an overall score (Likert scale 1-5), was given for every lesion. ECE was suspected in the presence of established MRI criteria such as neurovascular bundle asymmetry, obliteration of the rectoprostatic angle, irregular bulging of the prostatic contour, tumour signal intensity within the periprostatic fat, and overt extracapsular tumour. Lesion diameters were assessed each time on the T2-weighted sequences. MTD was defined as the largest diameter of a lesion. For each side of the prostate, the following variables related to the index lesion were collected: PI-RADS score, MTD, location, and T3 suspicion as assessed by a radiologist.

Biopsy

Patients were qualified to prostate biopsy based on PSA elevation (>4 ng/mL) or abnormal DRE. Tru-cut biopsy was performed systemically and guided with transrectal ultrasound. MRI was performed after the biopsy and was not used to guide it. In case of suspicious lesion visible in TRUS, additional targeted cores were collected.

Histopathology

Prostate biopsy pathological reports were reviewed retrospectively. Only reports containing separate information for both sides of the prostate on Gleason score, number of cores, number of positive cores, and area of biopsy cores invaded by cancer were analyzed.

All samples from radical prostatectomy were evaluated by a single genitourinary pathologist who was aware of clinical information of the patient. Gleason grading was performed according to the modified consensus of the International Society of Urological Pathology in 2005.



Statistical analysis

Continuous variables are presented as medians with the corresponding interquartile ranges (IQR). Univariate and multivariate logistic regression analyses were performed to identify predictors of ECE. To identify any nonlinear relations with ECE, continuous variables were initially analyzed in nonlinear generalized additive models and presented as splines. In the next step, continuous variables were transformed into categorical variables by setting cut-offs. Thresholds were defined based on spline knots which were identified for most significant gain in predicted ECE risk. If more than one knot was present or knot represented wide range of variable values, cut-off representing lower value was selected to minimalize false negatives. If no nonlinear relation was found for variable, already existing cut-offs that describe D'Amico risk groups were used (PSA: 10-20 ng/ mL and > 20 ng/mL; GS = 7 and GS ≥ 8). If no nonlinear relation with ECE was found and variable is not included in D'Amico risk grouping, Youden's J statistic (J= sensitivity + specificity -1) was used for setting threshold value. To construct the final model, variables transformed as above were used. The independent categorized predictors of ECE were identified using multivariate logistic regression analysis. To evaluate calibration of the model Hosmer-Lemeshow test was performed and calibration plots were created. Model was than adjusted for binary decision rules and clinical algorithm was created. Area under receiver-operating characteristic (ROC) curve, sensitivity, specificity, positive (PPV) and negative predictive value (NPV) of the algorithm, and its components were calculated for bootstrapped data to avoid any optimistic bias.

To refer accuracy, parameters of our algorithm to other tools MSKCC nomogram [6] and recently reported its modification including MRI data by Feng et al. [12] were validated in the same patient group.

Analyses were performed using SAS 9.4 software (SAS Institute, Cary, USA). The threshold for significance was set at P < 0.05.

Results

Of the 164 patients who underwent RP at the designated period 88 individuals had MP-MRI performed according to the protocol and met other inclusion criteria. Mean age was 63.5 years (range 49–83) and mean PSA was 10.5 ng/mL (IQR = 6.6). In this group, 41 men (46.6%) had ECE including 10 with seminal vesicle invasion (11.4%). There were three patients (3.4%) with positive lymph nodes. ECE was reported in 53 lobes (30.1%). Positive surgical margins were reported in 30 patients (34.1%). Suspicious lesions (PI-RADS 3-5) in MP-MRI were described in 82 patients

(93.2%) and 116 lobes (65.9%). Radiological signs suggesting ECE were found in 30 patients (34.1%) and 37 lobes (21.0%). Sensitivity, specificity, PPV, and NPV of MP-MRI alone in predicting ECE were 41.5%, 88%, 59.5%, and 77.8% respectively. Detailed clinical characteristics are summarized in Tables 1 and 2.

In the univariate analysis, PSA, PSAD, abnormal DRE or TRUS, number of positive cores, percent of positive cores, total percentage of cancerous tissue in cores, Gleason score ≥7, suspicion of ECE in MP-MRI, and MTD in MP-MRI were significantly associated with ECE (Table 3). In the multivariate analysis, PSA, total percentage of cancerous tissue in cores, and MTD were independent predictors of ECE (Table 3).

Spline analysis revealed that MTD and total percentage of cancerous tissue in cores might be associated with ECE in a nonlinear pattern (P < 0.03 and P < 0.09, respectively). Based on spline knots, cut-offs were identified as 15% for total percentage of cancerous tissue and 15 mm for MTD (Fig. 1). Since no nonlinear relation with ECE was found for PSA, categorization of this variable was based on the cut-off that describes D'Amico risk groups. As a result, we propose the following rule to predict side-specific ECE:

high risk of right-/left- side ECE if:

%PCa in right/left biopsy specimen ≥ 15%

OR MTD (MRI) of a lesion Likert 3, 4 or $5 \ge 15$ mm in right/left lobe OR PSA ≥ 20 ng/mL.

Since PSA is not side-specific parameter, according to the rule PSA \geq 20 ng/mL should be interpreted as the presence of ECE in both lobes. In the multivariate analysis this composed parameter appeared to be significantly associated with ECE (Table 3). Eight patients (8.1%) had PSA \geq 20 ng/mL, 53 patients (60.0%) had %PCa \geq 15% in left or right lobe, and 43 patients (48.8%) had MTD \geq 15 mm in left lobe or right lobe.

Hosmer–Lemeshow confirmed goodness of fit (P=0.49). Sensitivity, specificity, PPV, and NPV of the final model (bootstrapped data) as well as for MSKCC nomogram and MSKCC nomogram integrated with MP-MRI (Feng nomogram) are presented in Table 4.

Discussion

The ECE prediction rule developed in this study is both sidespecific and simple. It is based on the parameters of three different tests, thanks to which their values complement each other. The calculated accuracy is similar to the more complex nomograms. The tools developed so far mostly present the ECE risk as a percent value, which means that cut-off value must be also chosen for the risk that we are able to



Table 1 Clinical and pathological characteristics of the patients

Variables	No. of patients (%)		
PSA			
<4	6 (6.8%)		
< 10	62 (70.5%)		
10–20	19 (21.6%)		
>20	7 (8%)		
Unilateral cancer	41 (46.6%)		
Bilateral cancer	47 (53.4%)		
Biopsy Gleason score			
≤6	41 (46.6%)		
3+4	26 (29.5%)		
4+3	10 (11.4%)		
8	7 (8%)		
≥9	4 (4.5%)		
PSAD			
< 0.15	25 (28.4%)		
0.15-0.2	32 (36.4%)		
>0.2	31 (35.2%)		
Clinical stage (DRE and TRUS)			
cT1c	24 (27.3%)		
cT2-3	64 (72.7%)		
Likert 3–5 lesion in MRI			
Total	82 (93%)		
Unilateral	24 (29.3%)		
Bilateral	58 (70.7%)		
ECE in MRI			
Total	30 (34.1%)		
Unilateral	23 (26.1%)		
Bilateral	7 (8.0%)		
pT			
pT2a-b	18 (20.5%)		
pT2c	29 (33.0%)		
pT3a	31 (35.2%)		
pT3b	7 (8.0%)		
pT3bN1	3 (3.4%)		
PSM	30 (34.1%)		
Final Gleason Score			
≤ 6	16 (18.2%)		
3+4	33 (37.5%)		
4+3	18 (20.5%)		
8	14 (15.9%)		
≥9	7 (8.0%)		

PSA prostate-specific antigen (ng/mL), PSAD prostate-specific antigen density (ng/mL²), cT clinical stage (DRE/TRUS), ECE extracapsular extension, MRI magnetic resonance imaging, pT pathological stage, PSM positive surgical margins;

accept. In contrast, our model gives a dichotomous value. Hence, calculating the performance of this test becomes also simple. Most of the nomograms either do not allow

Table 2 Preoperative and postoperative characteristics of tumour or cancer

Variable	Number (%)	
No of lobes (sides)	176	
Preoperative		
Cancer present	128 (72.7%)	
%CaP≥15%	61 (35.3%)	
Gleason score (biopsy)		
3+3	68 (38.9%)	
3+4	34 (19.4%)	
4+3	11 (6.3%)	
8 or higher	15 (8.5%)	
$T + (MRI)^a$	116 (65.9%)	
$MTD (MRI) \ge 15 \text{ mm}^a$	51 (29.0%)	
ECE (MRI)	37 (21.0%)	
Postoperative		
Cancer present	144 (81.8%)	
ECE (+)	53 (30.1%)	
Gleason score (postoperative)		
3+3	25 (14.2%)	
3+4	57 (32.4%)	
4+3	27 (15.3%)	
8 or higher	35 (19.9%)	

ECE extracapsular extension, %CaP percentage of cancer in biopsy cores, T+ tumour found on specific examination, MTD maximum tumour diameter, MRI magnetic resonance imaging

assessing ECE risk selectively for the side, or do not use MRI parameters, but only clinical and biopsy-driven.

ECE is the most common of adverse feature found in pathology after RP [14]. Patients with ECE are more likely to have positive surgical margins [15], recur [16], and die from the prostate cancer [17]. Inadequate qualification of patients with ECE to nerve-sparing prostatectomy increases the risk of PSM and results in need for adjuvant or salvage radiotherapy. For this reason, whenever ECE is suspected, wider dissection, possibly with resection of neurovascular bundles, is recommended. To improve preoperative risk assessment, numerous nomograms have been developed. Partin tables which included PSA, Gleason score, and clinical stage was the first tool developed to estimate risk of nonorgan-confined PCa. However, the tables were not able to distinguish unilateral from bilateral ECE [7]. This issue was solved in other side-specific tools based on biopsy, PSA, and DRE results [1, 2, 5, 6]. The main advantage of first studies is their sample size and extensive external validation, whereas not implementing radiological data remains the main limitation.

Simultaneously with ECE predictive tools development quality of MP-MRI reporting improved which made it possible to include MRI in active surveillance protocol [18] and



aLesions classified 3, 4, or 5 on Likert scale

Table 3 Univariate and multivariate analyses of clinical and pathological factors that predict side-specific prostate cancer extracapsular extension

Variables	Univariate			Multivariate		
	OR ^b (95% CI)	p	AUC	OR ^b (95% CI)	p	
Initial model						
PSA	2.9 (1.7-5.0)	0.0002	0.660	3.1 (1.5-6.3)	0.0005	
cT+ ^a	3.0 (1.5-6.4)	0.0032	0.627		NS	
No. of positive cores ^a	1.8 (1.4–2.4)	< 0.0001	0.711		NS	
% of positive cores ^a	2.4 (1.6-3.4)	< 0.0001	0.724		NS	
% of cancer in cores ^a	2.5 (1.8-3.6)	< 0.0001	0.761	2.2 (1.5–3.5)	< 0.0001	
GS^a	2.2 (1.4–3.3)	0.0004	0.682		NS	
ECE on MRIa	5.1 (2.4–11)	< 0.0001	0.647		NS	
$\mathrm{MTD}^{\mathrm{a}}$	2.6 (1.8-3.9)	< 0.0001	0.753	1.8 (1.2-2.9)	0.006	
Final model ^c						
$MTD \ge 15 \text{ mm}^a$				7.8 (3.3–18.9)	< 0.0001	
% of cancer in cores $\geq 15\%^a$				6.9 (2.9–16.3)	< 0.0001	
PSA 10-20 ng/mL				1.4 (0.5–3.6)	NS	
$PSA \ge 20 \text{ ng/mL}$				16.6 (2.6–105)	0.0028	

OR odds ratio, *AUC* area under curve, *CI* confidence interval, *PSA* prostate-specific antigen (ng/mL), *PSAD* prostate-specific antigen density (ng/mL²), *cT*+ tumour found on digital rectal examination or transrectal ultrasound, *ECE* extracapsular extension, *MRI* magnetic resonance imaging, *GS* Gleason Score, *MTD* maximum tumour diameter in MRI (mm), *NS* not significant

^aSide-selective variables, ^bOR normalized to 1 SD, ^cmultivariate model based on independent basic model variables that were categorized

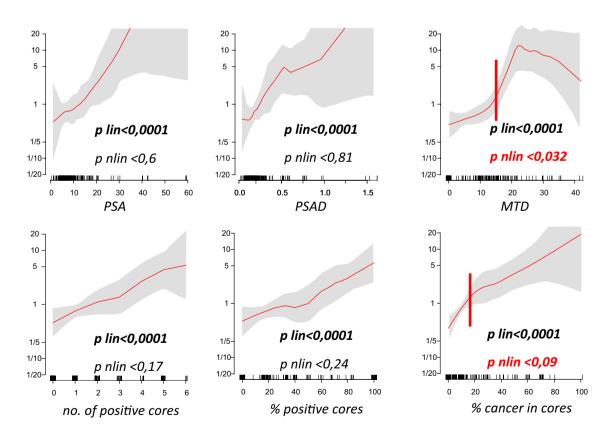


Fig. 1 Splines for continuous predictors of extracapsular extension

Table 4 Sensitivity, specificity, PPV, and NPV of our algorithm in the internal validation using bootstrap method and of Ohori and Feng nomograms applied to our group in predicting cancer extracapsular extension

	Sensitivity (95% CI)	Specificity (95%	CI)	PPV (95% CI)	NPV (95% CI)
Model internal va	lidation, bootstrap $n = 200$				
Model ^a	91% (83–92)	74% (65–98)		54% (44–65)	94% (89–99)
	ECE probability cut-off (%)	Sensitivity (%)	Specificity (%)	PPV (%)	NPV (%)
Performance of ot	her models in our group				
Ohori (6)	≥10	98	35	37	97
	≥20	71	69	47	86
	≥30	57	80	52	83
	≥40	55	85	59	83
	≥50	40	92	65	80
Feng (11)	≥10	71	80	58	88
	≥20	67	83	61	87
	≥30	57	89	67	84
	≥40	52	90	69	83
	≥50	43	92	67	80

PPV positive predictive value, NPV negative predictive value, CI confidence interval, ECE extracapsular extension, MTD maximum tumour diameter

surgical planning [3, 9]. Since, in patients without suspicious lesions in MP-MRI, the risk of clinically significant PCa is low, MP-MRI has potential to significantly reduce overtreatment [19]. In patients considered for radical treatment, on the other hand, supplementing standard T2-weighted images with diffusion-weighted imaging (DWI) not only reduces biopsy sampling error [20], but offers additional assessment of tumour aggressiveness [21] and improves staging accuracy [4, 22]. It has been proved that decrease of apparent diffusion coefficient (ADC) is associated with harbouring a poorly differentiated cancer independently of biopsy characteristics [23]. Moreover, ADC seems to correlate negatively with cancerous tissue volume marking large lesions [24].

Advances in functional MRI imaging reduced clinical role of previously developed clinical prognostic models. Gupta et al. pointed out that MP-MRI outperformed Partin tables in tumour staging and might reach 90% NPV for ruling out pT3 [25]. Recent metanalysis indicates, however, that staging based on MRI alone lacks sensitivity in detecting ECE; thus, it can miss many pT3 tumours [26]. Moreover, what can be troublesome in defining utility of staging MP-MRI is its dependence on tumour size and location [27], additional modalities used [4, 22], technical aspects of the scanner [22, 28, 29], use of endorectal coil [30], and, most importantly, experience of the radiologist [31, 32]. Aforementioned factors limit the use of MP-MRI alone in predicting ECE. Instead, MP-MRI possesses great potential to complement the classic clinical parameters used in preoperative staging. It is apparent that MRI has ability to supplement clinical data and improve prediction accuracy on nomograms [11, 12, 33]. Feng et al. reported that both Partin tables and MSKCC nomogram by Ohori et al. can improve their accuracy by adding MP-MRI parameters with AUC increasing from 0.85 to 0.92 and 0.86 to 0.94, respectively [12]. Accuracy of both basic models in the study is worth noting as it is relatively high among the existing studies [1, 6]. In our cohort, MSKCC nomogram expressed AUC of 0.794 increasing to 0.816 after supplementing MP-MRI using model by Feng et al. (http://www.cedars-sinai.edu/ PathologicECE) which corresponds with aforementioned literature data. Chen et al. updated Ohori and Partin models with ECE risk score by ESUR observing AUC 0.851 for the final model [11]. Recently Morlacco et al. reported that using staging MP-MRI as adjunct for Partin tables and Cancer of the Prostate Risk Assessment (CAPRA) estimates increases its AUC from 0.6106 to 0.7327 and from 0.6907 to 0.7701, respectively [33].

PCa staging with MP-MRI alone is highly dependent on radiologist's experience [31, 32]. Expert radiologist can reach sensitivity of over 80% with 96% NPV (non-side-specific), while a colleague from the same institution without experience can be less accurate than DRE [31]. The initial lack of experience in prostate MP-MRI reading may be a reason why in our study MTD was found to be much more informative than radiological signs of ECE in multivariate analysis. Although lesion size is often underestimated [9], MTD measurement seems to be less subjective than radiologist judgment on tumour local spread. Largest tumour



^aECE present at the specific prostate side if: MTD≥15 mm (side-specific) OR % cancer in cores≥15% (side-specific) OR PSA≥20 ng/mL (not side-specific)

diameter has been also previously described as potential pathologic predictor of disease recurrence and local spread [13, 34].

In this retrospective study, we aimed at defining clear group at risk of ECE that could aid decision-making in qualification for side-specific nerve-sparing, focal treatment, or active surveillance. To fulfil this aim and provide easy clinical implementation, we categorized PSA that was an independent predictor of ECE using thresholds according to D'Amico grouping. Using high-risk PSA and cut-offs for MTD and total percentage of cancer in cores defined during non-linearity analysis, we developed a simple rule for predicting side-specific ECE. Internal validation of the algorithm revealed safe lower confidence limits for sensitivity (82.6%) and NPV (89.2%). Since lower confidence limits simulate most pessimistic clinical performance, we assume that model provides accurate risk grouping that can be safely used in decision-making. Validation of MSKCC without and with MP-MRI yielded high sensitivity (71% and 67% respectively) and NPV (86% and 87% respectively) when 20% risk threshold was attached. After supplementing Ohori nomogram with imaging staging, the gain was visible in specificity (69% vs 83%) which again confirms that greatest value of MRI lies at reducing false positives.

Concluding these results, it should be emphasized that our algorithm does not seem to be inferior neither to MSKCC side-specific nomogram [6] nor to its recent update by Feng et al. [12], yet offers easier clinical application. The rule based on three conditions gives straightforward outcome suggesting the presence or lack of ECE, whereas nomograms can be hard to drive decisions when percentage of risk is within "grey zone". However, any categorical statements are premature as our study is based on a limited number of patients from a single institution. Retrospective design predisposes to selection bias. Biopsy technique (systemic and targeted if required) may also affect results. Both increased and decreased numbers of cores collected may affect the significance of PCa percentage in biopsy. It seems that future developments should resolve this problem [1–3, 5, 6, 12, 33]. Due to analyzed period (2012–2014), ISUP 2005 Gleason score and PIRADS v1 were used in predictive analysis which might cause relatively low predictive value of this variable. High rate of biopsy Gleason score 3+3 and much higher final Gleason score suggest that mapping biopsy is insufficient for reliable assessment of tumour aggressiveness. Implementation of prebiopsy MRI and targeted biopsy should improve this issue. Finally, our study lacks external validation, and thus, future investigation is needed to minimize overfitting and validate its clinical performance.

Take Home Message The rule developed in this study makes ECE prediction fast, intuitive, and side-specific. However, until validated externally, it should be used with caution.

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Availability of data and materials The data sets used and analyzed during the current study are available from the corresponding author on reasonable request.

Compliance with ethical standards

Conflict of interest The authors declare that they have no conflict of interest.

Ethical approval All procedures performed during the study were in accordance with the ethical standards of the institutional and national research committee and with the 1964 Helsinki declaration and its later amendments. For this type of study, formal consent is not required.

Informed consent Informed consent was obtained from all individual participants included in the study.

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