

## Nomogram for the prediction of lymph node metastasis and survival outcomes in rectal neuroendocrine tumour patients undergoing resection

## Qichen Chen, Jinghua Chen, Yiqiao Deng, Yizhou Zhang, Zhen Huang, Hong Zhao^, Jianqiang Cai

Department of Hepatobiliary Surgery, National Cancer Center/National Clinical Research Center for Cancer/Cancer Hospital, Chinese Academy of Medical Sciences and Peking Union Medical College, Beijing, China

*Contributions:* (I) Conception and design: H Zhao, J Cai; (II) Administrative support: H Zhao, J Cai; (III) Provision of study materials or patients: Q Chen, J Chen; (IV) Collection and assembly of data: All authors; (V) Data analysis and interpretation: Q Chen; (VI) Manuscript writing: All authors; (VII) Final approval of manuscript: All authors.

*Correspondence to:* Hong Zhao. Department of Hepatobiliary Surgery, National Cancer Center/National Clinical Research Center for Cancer/Cancer Hospital, Chinese Academy of Medical Sciences and Peking Union Medical College, 17 Panjiayuan Nanli, Chaoyang District, Beijing 100021, China. Email: zhaohong@cicams.ac.cn.

**Background:** The current study analysed rectal neuroendocrine tumour (RNET) patients undergoing resection to identify predictive factors and construct nomograms for lymph node metastasis, cancer-specific survival (CSS) and overall survival (OS).

**Methods:** RNET patients registered in the Surveillance, Epidemiology, and End Results (SEER) database were included in this study. Multivariable logistic regression analysis was used to investigate the relationships between clinicopathological factors and lymph node metastasis. A multivariate competing risk model was applied to investigate factors independently associated with CSS. Through the Cox regression model, a multivariable analysis of OS was performed. Nomograms were established based on independent predictive factors. Calibration plots, receiver operating characteristic (ROC) curves and Brier scores were used to evaluate the predictive accuracy of the nomograms.

**Results:** In this study, 1,253 RNET patients were included for further analysis. Tumour size  $\geq 12$  mm (P<0.001), T3/T4 stage (P<0.001) and M1 stage (P=0.001) were independently associated with lymph node metastasis. The performance of the nomogram was acceptable for predicting lymph node metastasis, with an area under the ROC curve (AUC) of 0.937 [95% confidence interval (CI): 0.874–1.000]. Calibration curves and the Hosmer-Lemeshow test revealed desirable model calibration (P=0.99996). The multivariate competing risk model analysis showed that grade II (P=0.017), tumour size  $\geq 12$  mm (P=0.007), AJCC TNM stage II (P=0.002), stage III (P<0.001) and stage IV (P<0.001) were significantly associated with worse CSS. In the competing risk nomogram model, the time-dependent AUC revealed good discriminatory ability of the model (time from 1 to 107 months, AUC >0.900), and the Brier score showed good accuracy of the nomogram, which was greater than that of the AJCC TNM stage. Multivariate Cox analysis showed that age >60 years (P=0.002), median income  $\geq$ \$65,000 (P=0.013), AJCC TNM stage III (P=0.038) and AJCC TNM stage IV (P<0.001) were independently associated with worse OS. In the nomogram for the prediction of OS, the C-statistic was 0.703 (95% CI: 0.615–0.792), which was significantly better than that of the AJCC TNM stage (0.703 *vs.* 0.607, P=0.009). A calibration plot for the probability of survival demonstrated good calibration.

**Conclusions:** The present study is the first to establish nomograms with great discrimination and accuracy for the prediction of lymph node metastases, CSS and OS in RNET patients, which can be used to guide treatment decision-making and surveillance.

**Keywords:** Rectal neuroendocrine tumours (RNETs); lymph node metastasis; survival; nomogram; Surveillance, Epidemiology, and End Results (SEER)

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## Introduction

The worldwide incidence of neuroendocrine neoplasms (NENs) has risen substantially in recent decades (1,2). The rectum is the most frequent site of digestive tract NENs (2). Additionally, the prevalence of rectal neuroendocrine tumours (RNETs) has steadily increased, reaching approximately 1.2/100,000 per year in 2012 (3). RNETs are increasingly diagnosed due to the widespread use of colonoscopy for colorectal tumour screening.

NENs are considered tumours with indolent biological behaviour and a relatively favourable prognosis (4). RNETs are no exception, and small low-grade lesions localized to the submucosa are present in most RNET cases, which leads to an excellent prognosis and a median survival time of approximately 24.6 years (2); however, the survival of RNET patients can worsen if risk factors are present, including large tumour size, lymph node metastasis and distant metastasis (5-7). The tumour size of RNETs is an important factor for survival outcomes and treatment strategies (5-7). Treatment strategies are recommended based on RNET tumour sizes. According to the current National Comprehensive Cancer Network (NCCN) guidelines (8), RNETs >2 cm should be treated with radical resection, while RNETs <1 cm should be treated with transanal or endoscopic excision. However, there is no clear consensus in the NCCN guidelines on the treatment of 1 to 2 cm RNETs. Additional assessment of the depth of invasion and the status of the lymph nodes has been recommended to help guide the type of resection used for 1- to 2-cm RNET patients. Furthermore, the prediction of lymph node metastasis is critical, not only because lymph node metastasis is an important factor affecting the prognosis of RNET patients (9), but also because the evaluation of lymph node metastasis is essential for determining the best surgical strategy, local excision or radical rectal resection. When lymph node metastasis is highly suspected, radical rectal resection with lymph node dissection should be performed. It is necessary to construct predictive models to predict the status of lymph nodes before treatment and survival outcomes after resection

in RNET patients, which will be helpful for treatment decision-making and surveillance. To date, few studies have focused on this demand.

In this study, we aimed to identify predictive factors and construct nomograms for lymph node metastasis and survival outcomes in RNET patients using the populationbased Surveillance, Epidemiology, and End Results (SEER) database. We present the following article in accordance with the TRIPOD reporting checklist (available at https:// jgo.amegroups.com/article/view/10.21037/jgo-21-573/rc).

### **Methods**

## Data collection and patient population

Information about the patients enrolled in this study was collected from the Incidence-SEER 18-registry Research Data (10). We extracted data on patients diagnosed with NETs located in the rectum between 2000 and 2018 by using SEER\*Stat software (version 8.3.9) (8). The inclusion criteria were as follows: (I) pathologically diagnosed RNETs and (II) underwent surgery. The exclusion criteria were as follows: (I) with another malignant tumour; (II) survival time <1 month; (III) age <18 years; and (IV) incomplete patient information. Overall, 1253 eligible patients were selected for this study (*Figure 1*). No personal identifying information was used in the study; therefore, we did not require any informed consent. The study was conducted in accordance with the Declaration of Helsinki (as revised in 2013).

## Variable declaration

Clinicopathological variables included age at diagnosis, sex, race, histological grade, T stage (AJCC, 7th ed.), N stage (AJCC, 7th ed.), M stage (AJCC, 7th ed.), tumour size, survival time, cause of death etc. were retrieved. AJCC 7th TNM stage was divided into stages I through IV according to T stage, N stage and M stage. The optimal cut-off value of tumour size for survival was obtained by X-tile analysis. The duration between the date of diagnosis and the date of death due to RNETs was calculated as the cancer-



Figure 1 Flow diagram for the selection of RNETs. RNETs, rectal neuroendocrine tumours; SEER, Surveillance, Epidemiology, and End Results.

specific survival (CSS) time. The duration between the date of diagnosis and the date of death due to any cause was calculated as the overall survival (OS) time.

## Statistical analysis

Continuous variables were expressed as medians [interquartile ranges (IQRs)], whereas categorical variables were presented as counts and percentages. The chisquare test or Fisher's exact test was used to compare the differences in categorical variables. The optimal cut-off value of tumour size for survival was determined by X-title analysis. Survival comparisons were conducted using Kaplan-Meier analysis and log-rank tests.

Predictors with P<0.10 in the univariate analysis were retained in the multivariate models. A multivariable analysis of the relationships between clinicopathological parameters and lymph node metastasis was performed by logistic regression analysis model. To complete competing the risk analysis, the noncancer-specific death rate was employed as the competing factor, and Grey's test was used to identify significant differences between groups. The risk factors associated with the survival outcomes of the patients were identified by the Fine-Grey multivariable regression model, and the results were presented as subdistribution hazard ratios (SHRs) and the associated 95% confidence interval (CI). Through the Cox regression model, a multivariable analysis of the OS was performed, which was presented as the HR and 95% CI. P<0.05 was considered statistically significant. All statistically significant risk factors were used to construct the nomogram. The discrimination ability of the model was performed by area under the receiver operating characteristic curve (AUC) and C-index. To evaluate the model calibration, calibration plots and the Hosmer-Lemeshow chi-square test were performed. The Brier score was used to measure the overall performance of the model, covering all aspects of calibration and discrimination. The score ranges from 0 to 1, and the closer the value is to 0, the better the prediction performance of the model. Statistical significance was achieved if the two-tailed P value was <0.05. SPSS Statistics 25.0 (IBM Corporation, Armonk, NY, USA) and R version 3.5.1 (https://www.r-project.org/) were used to perform statistical analyses.

#### **Results**

### Clinicopathological characteristics

A total of 10,057 patients diagnosed with RNETs from 2010 to 2018 were screened from the SEER database. After eliminating 8,804 patients based on the exclusion criteria, 1,253 RNET patients were included for further analysis (Figure 1). The baseline demographic, clinical and pathological features were summarized in Table 1. Of these patients, 643 (51.32%) were male, and 610 (48.68%) were female. The mean age at diagnosis was 53.79±10.59 years. Ninety-four patients received radical resection, and 1,159 underwent local excision. The median tumour size was 5 [3–8] mm. The tumour grade was I in 1,086 (86.67%) patients, II in 155 (12.37%), III in 9 (0.73%) and IV in 3 (0.23%) patients. The T stage was T1 in 1,169 (93.30%) patients, T2 in 65 (5.19%) patients, T3 in 16 (1.28%) patients and T4 in 3 (0.23%) patients. Twenty-three patients experienced lymph node metastasis, and 14 patients experienced distant organ metastasis. AJCC 7th TNM stage was I in 1,161 (92.66%) patients, II in 64 (5.11%) patients, III in 14 (1.12%) patients and IV in 14 (1.11%) patients.

# Predictors and construction of a nomogram for the prediction of lymph node metastasis

In the univariate analysis, other race (P=0.004), grade

 Table 1 Clinicopathological characteristics in 1,253 RNETs

 patients

Items	Patients, n (%)
Age (years)	
≤60	924 (73.74)
>60	329 (26.26)
Sex	
Female	610 (48.68)
Male	643 (51.32)
Race	
White	687 (54.83)
Black	292 (23.30)
Other	274 (21.87)
Year of diagnosis	
2010–2012	412 (32.88)
2013–2015	841 (67.12)
Population	
Rural/urban	94 (7.50)
Metropolitan	1,159 (92.50)
Median income (\$)	
<49,999	165 (13.17)
50,000–64,999	459 (36.63)
≥65,000	629 (50.20)
Treatment type	
Local excision	1,159 (92.50)
Radical resection	94 (7.50)
Grade	
Grade I	1,086 (86.67)
Grade II	155 (12.37)
Grade III	9 (0.73)
Grade IV	3 (0.23)
Tumour size (mm), median [IQR]	5 [3–8]
T stage	
T1	1,169 (93.30)
T2	65 (5.19)
ТЗ	16 (1.28)
T4	3 (0.23)

 Table 1 (continued)

Table 1 (continued)	
Items	Patients, n (%)
N stage	
N0	1,230 (98.16)
N1	23 (1.83)
M stage	
M0	1,239 (98.88)
M1	14 (1.12)
AJCC TNM stage	
I	1,161 (92.66)
II	64 (5.11)
III	14 (1.12)
IV	14 (1.11)

RNETs, rectal neuroendocrine tumours; IQR, interquartile range.

III/grade IV (P<0.001), tumour size  $\geq 12 \text{ mm}$  (P<0.001), T3/T4 stage and M1 stage (P<0.001) were significantly associated with the presence of lymph node metastasis. All the abovementioned predictors were included in the multivariate analysis, and tumour size  $\geq 12 \text{ mm}$  [odds ratio (OR) =40.401; 95% CI: 8.477-192.543; P<0.001], T3/T4 stage (OR =12.596; 95% CI: 3.505-45.266; P<0.001) and M1 stage (OR =9.185; 95% CI: 2.195-38.433; P=0.001) were independently associated with lymph node metastasis (Table 2). A nomogram with the three independent predictors from the multivariate analysis was constructed (Figure 2). These factors were assigned specific scores as follows: tumour size  $\geq 12$  mm, 100; T3/T4 stage, 68; and M stage, 59. The total risk scores of each patient based on the nomogram were calculated, and the total points ranged from 0 to 227. The optimal cut-off value was 84 with a specificity of 0.908 and a sensitivity of 0.913. The performance of the model was acceptable for predicting lymph node metastasis, with an AUC of 0.937 (95% CI: 0.874-1.000) (Figure 3A). Calibration curves and the Hosmer-Lemeshow test revealed desirable model calibration (P=0.99996) (Figure 3B).

## Prognostic factors for CSS and construction of a competing risk nomogram for CSS prediction

The univariable competing risk model analysis showed that radical resection (P<0.001), grade III/grade IV (P<0.001), tumour size  $\geq$ 12 mm (P<0.001), T2 stage (P<0.001), T3/T4

Table 2 Predictive	factors	for lym	ph node	metastasis	in	<b>RNE</b> T	Ŀ
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Itomo	ι	Inivariate analysis	Multivariate analysis		
	Р	OR (95% CI)	Р	OR (95% CI)	
Age (years)					
≤60		Reference			
>60	0.620	0.777 (0.286–2.109)			
Sex					
Female		Reference			
Male	0.358	1.486 (0.639–3.459)			
Race					
White		Reference			
Black	0.372	1.692 (0.533–5.377)			
Other	0.004	4.063 (1.558–10.593)			
Year of diagnosis					
2010–2012		Reference			
2013–2015	0.521	0.758 (0.325–1.766)			
Population					
Rural/urban		Reference			
Metropolitan	0.080	0.375 (0.125–1.126)			
Median income (\$)					
<49,999		Reference			
50,000–64,999	0.797	0.836 (0.214–3.273)			
≥65,000	0.840	1.140 (0.321–4.047)			
Grade					
Grade I		Reference			
Grade II	0.386	0.408 (0.054–3.090)			
Grade III and grade IV	<0.001	44.916 (12.951–155.778)			
Tumour size (mm)					
<12		Reference		Reference	
≥12	<0.001	103.792 (24.026–448.378)	<0.001	40.401 (8.477–192.543)	
T stage					
T1 and T2		Reference		Reference	
T3 and T4	<0.001	140.021 (47.855–409.696)	<0.001	12.596 (3.505–45.266)	
M stage					
M0		Reference			
M1	<0.001	157.500 (46.801–530.040)	0.002	9.185 (2.195–38.433)	

RNETs, rectal neuroendocrine tumours; OR, odds ratio; CI, confidence interval.



Figure 3 Evaluation of nomogram for the prediction of lymph node metastases. (A) ROC curves; (B) calibration curves. ROC, receiver operating characteristic; AUC, area under the ROC curve; CI, confidence interval.

stage (P<0.001), N1 stage (P<0.001), M1 stage (P<0.001), AJCC TNM stage II (P<0.001), III (P<0.001) and IV (P<0.001) were related to worse CSS outcomes. AJCC TNM stage was constructed based on the T stage, N stage and M stage. To avoid collinearity, AJCC TNM stage was included in the multivariate analysis rather than T stage, N stage and M stage. The multivariate competing risk model analysis showed grade II (SHR =9.981; 95% CI: 1.5124– 65.859; P=0.017), tumour size  $\geq$ 12 mm (SHR =6.034; 95% CI: 1.608–22.642; P=0.007), AJCC TNM stage II (SHR =15.656; 95% CI: 2.6035–94.143; P=0.002), stage III (SHR =55.508; 95% CI: 8.169–377.147; P<0.001) and stage IV (SHR =167.641; 95% CI: 8.619–3,260.394; P<0.001) were significantly associated with worse CSS outcomes (*Table 3*). The competing risk nomogram model was constructed based on independent prognostic factors (*Figure 4*). The nomogram showed that the AJCC TNM stage was the most impacted factor relating to prognosis, followed by tumour size and then grade. The estimated probability of survival can be determined at each time point on the total point scale, according to the total points. The time-dependent AUC revealed the good discriminatory ability of the

<b>TADIE J</b> I TEULUVE IACIOIS IOI COOS WILL COMDELING TISK MOUEL III	Table 3	Predictive	factors for	· CSS	with	competing	risk mode	l in RNET
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	ι	Jnivariate analysis	М	ultivariate analysis
Items	Р	SHR (95% CI)	Р	SHR (95% CI)
Age (years)				
≤60		Reference		
>60	0.587	1.394 (0.421–4.613)		
Sex				
Female		Reference		
Male	0.112	2.888 (0.781–10.690)		
Race				
White		Reference		
Black	0.986	0.988 (0.256–3.809)		
Other	0.676	0.715 (0.149–3.443)		
Year of diagnosis				
2010–2012		Reference		
2013–2015	0.783	0.843 (0.249–2.856)		
Population				
Rural/urban		Reference		
Metropolitan	0.246	0.406 (0.089–1.860)		
Median income (\$)				
<49,999		Reference		
50,000–64,999	0.566	0.665 (0.165–2.681)	0.594	0.608 (0.098–3.783)
≥65,000	0.083	0.250 (0.052–1.196)	0.139	0.195 (0.022–1.698)
Treatment type				
Local excision		Reference		
Radical resection	<0.001	11.760 (3.694–37.460)	0.891	1.125 (0.209–6.085)
Grade				
Grade I		Reference		
Grade II	0.058	4.059 (0.952–17.310)	0.017	9.981 (1.5124–65.859)
Grade III and grade IV	<0.001	86.172 (22.696–327.190)	0.527	2.181 (0.194–24.507)
Tumour size (mm)				
<12		Reference		
≥12	<0.001	91.37 (11.87–703.2)	0.007	6.034 (1.608–22.642)
T stage				
T1		Reference		
T2	<0.001	26.87 (4.409–163.7)		
T3 and T4	<0.001	281.60 (60.224–1316.7)		

Table 3 (continued)

20			Univariate analysis						Multivaria	ate analys	is
115			Р	SHR (95% CI)				Р		SHR (9	95% CI)
stage											
10					Referer	nce					
V1			<0.001	52	.78 (17.32	2–160.8)					
stage											
<b>v</b> 10					Referer	nce					
<b>v</b> 11			<0.001	88	.13 (31.12	2–249.6)					
ICC TNM stage											
					Referer	nce					
I			<0.001	57.18 (5.984–546.5)				0.002	15	6.656 (2.60	035– 94.143
			<0.001	155.83 (13.271–1829.9)			<0.001	55.508 (8.169– 377.1		69-377.14	
11						,					
V			<0.001	499.	99 (63.11	7–3960.7)		<0.001	167	.641 (8.6 <sup>-</sup>	19–3,260.39
" V 	rvival; RNE	Ts, rectal	<0.001 neuroend	499. ocrine tumo	99 (63.11 ours; SHR	7–3960.7) , subdistrik	oution h	<0.001 azard ratio;	167 Cl, confid	7.641 (8.6 <sup>-</sup> dence inte	19–3,260.39 erval.
" V 3S, cancer-specific su Points	rvival; RNE 0 	Ts, rectal	<0.001 neuroend	499. ocrine tumo 30	99 (63.11 purs; SHR 40	50	60	<0.001 azard ratio; 70	167 Cl, confic 80	2.641 (8.6 <sup>-</sup> dence inte	19–3,260.39 erval.
V SS, cancer-specific su Points	o	10	<0.001 neuroend	499. ocrine tumo 30	99 (63.11 ours; SHR	7–3960.7) , subdistrik 50	60	<0.001 azard ratio; 70	167 Cl, confic 80	2.641 (8.6 <sup>-</sup> dence inte 90	19–3,260.39 prval.
V SS, cancer-specific su Points AJCC TNM stage	o □ □ □ □	10 10	<0.001 neuroend	499. ocrine tumo 30	99 (63.11 <sup>°</sup> purs; SHR	7–3960.7) , subdistrib 50 , , , , , , , , , , , , , , , , , , ,	60	<0.001 azard ratio; 70	167 Cl, confic 80	90	19–3,260.39 prval. 100 
V SS, cancer-specific su Points AJCC TNM stage	o □ □ □ □	Ts, rectal 10 	<0.001 neuroend	499. ocrine tumo 30	99 (63.11 <sup>°</sup> burs; SHR 40 	7–3960.7) , subdistrib 50 	60 	<0.001 azard ratio; 70	167 Cl, confic 80	2.641 (8.6 <sup>-7</sup> dence inte 90	19–3,260.39 Prval. 100 
V SS, cancer-specific su Points AJCC TNM stage Tumor size	rvival; RNE	10 10	<0.001 neuroend	499. ocrine tumo	99 (63.11 <sup>-</sup> burs; SHR 40  ≥12	7–3960.7) , subdistrib 50 	60 	<0.001 azard ratio; 70 	167 Cl, confic 80	2.641 (8.6 <sup>-7</sup> dence inte 90	19–3,260.39 prval. 100  IV  III
" V SS, cancer-specific su Points AJCC TNM stage Tumor size Grade	rvival; RNE	10 10	<0.001 neuroend 20	499. ocrine tumo	99 (63.11 <sup>°</sup> burs; SHR 40 	7–3960.7) , subdistrib 50 	60 	<0.001 azard ratio; 70 	167 Cl, confid 80	90	19–3,260.39 prval. 100  IV III

Table 3 (continued)



40

60

80

100

120

0.95

0.9

l 0.95

140

0.9

160

0.97

0.85 0.8 0.75 0.7 0.65 0.6 0.550.50.450.40.35

0.85 0.8 0.75 0.7 0.65 0.6 0.55 0.5

180

0.96 0.95 0.94 0.930.92

200

0

1-year survival probability

3-year survival probability

5-year survival probability

20



Figure 5 Evaluation of Nomogram for the prediction of CSS. (A) AUC of the nomogram in the prediction of CSS; (B) Brier score of the nomogram for predicting CSS. CSS, cancer-specific survival; AUC, area under the receiver operating characteristic curve.

model (survival time from 1 to 107 months, AUC >0.900) (*Figure 5A*), and the Brier score showed good accuracy of the nomogram (*Figure 5B*), which was greater than that of the AJCC TNM stage.

## Prognostic factors for OS and construction of a nomogram for OS prediction

In the univariate analysis, age >60 years (P=0.004), median income  $\geq$ \$65,000 (P=0.015), radical resection (P=0.005), grade III/grade IV (P<0.001), tumour size ≥12 mm (P<0.001), T3/T4 stage (P<0.001), N1 stage (P<0.001), M1 stage (P<0.001), AJCC TNM stage III (P=0.039) and AJCC TNM stage IV (P<0.001) were significantly associated with worse OS. All the abovementioned predictors were included in the multivariate analysis, and age >60 years (HR =2.494; 95% CI: 1.389-4.478; P=0.002), median income ≥\$65,000 (HR =0.359; 95% CI: 0.161–0.804; P=0.013), AJCC TNM stage III (HR =4.559; 95% CI: 1.090–19.062; P=0.038) and AJCC TNM stage IV (HR =18.287; 95% CI: 7.564-44.211; P<0.001) were independently associated with worse OS (Table 4). A prognostic nomogram for OS outcomes with point scales for the above independent prognostic factors was constructed (Figure 6). These factors were assigned specific scores as follows: age >60 years, 31; AJCC TNM stage II, 23; AJCC TNM stage III, 52; AJCC

TNM stage IV, 100; median income <\$49,999, 35; median income \$50,000–64,999, 24. The total risk score calculated using the nomogram for each patient ranged from 0 to 166. The nomogram showed that the AJCC TNM stage was the most impacted prognostic factor, followed by income and then age. The C-statistic for OS rate prediction was 0.703 (95% CI: 0.615–0.792), which was significantly better than that of the AJCC TNM stage (0.703 *vs.* 0.607, P=0.009). A calibration plot for the probability of survival at 1, 3 and 5 years (*Figure 7A-7C*) demonstrated good calibration.

## Discussion

This is the first study to construct nomograms for the prediction of lymph node metastasis, CSS and OS outcomes in RNET patients who underwent resection based on a large sample size, which is helpful for treatment decision-making and surveillance for RNET patients.

The prediction of lymph node metastasis is helpful for choosing appropriate treatments for RNET patients, especially for RNETs with a tumour size <20 mm. The assessment of lymph node metastasis is critical for surgeons to determine whether to perform radical resection or local excision. For RNET patients with lymph node metastasis, there is no doubt that radical resection is a better treatment choice, and the survival outcomes Table 4 Predictive factors for OS in RNETs

	Uni	variate analysis	Mul	tivariate analysis
items	Р	HR (95% CI)	Р	HR (95% CI)
Age (years)				
≤60		Reference		
>60	0.004	2.355 (1.319–4.208)	0.002	2.494 (1.389–4.478)
Sex				
Female		Reference		
Male	0.104	1.644 (0.903–2.992)		
Race				
White		Reference		
Black	0.311	1.392 (0.734–2.640)		
Other	0.266	0.603 (0.247–1.470)		
Year of diagnosis				
2010–2012		Reference		
2013–2015	0.517	1.248 (0.638–2.439)		
Population				
Rural/urban		Reference		
Metropolitan	0.147	0.530 (0.225–1.250)		
Median income (\$)				
<49,999		Reference		
50,000–64,999	0.326	0.685 (0.322–1.457)	0.418	0.731 (0.342–1.560)
≥65,000	0.015	0.369 (0.166–0.822)	0.013	0.359 (0.161–0.804)
Treatment type				
Local excision		Reference		
Radical resection	0.005	2.855 (1.377–5.920)		
Grade				
Grade I		Reference		
Grade II	0.507	1.317 (0.584–2.966)		
Grade III and grade IV	<0.001	12.144 (4.312–34.202)		
Tumour size (mm)				
<12		Reference		
≥12	<0.001	3.259 (1.714–6.197)		
T stage				
T1		Reference		
T2	0.174	2.049 (0.728–5.767)		
T3 and T4	<0.001	15.900 (7.039–35.919)		

Table 4 (continued)

ltomo	Un	ivariate analysis	Multivariate analysis		
items	P HR (95% CI)		Р	HR (95% CI)	
N stage					
NO		Reference			
N1	<0.001	7.976 (3.375–18.853)			
M stage					
МО		Reference			
M1	<0.001	13.376 (5.661–31.606)			
AJCC TNM stage					
I		Reference			
Ш	0.127	2.240 (0.795–6.314)	0.206	1.956 (0.691–5.533)	
Ш	0.039	4.516 (1.081–18.866)	0.038	4.559 (1.090–19.062)	
IV	<0.001	14.779 (6.194–35.262)	<0.001	18.287 (7.564–44.211)	

Table 4 (continued)

OS, overall survival; RNETs, rectal neuroendocrine tumours; HR, hazard ratio; CI, confidence interval.



Figure 6 Nomogram model in the prediction of OS. OS, overall survival.



Figure 7 Calibration curves for predicting OS at (A) 1-year point, (B) 3-year point, (C) 5-year point. OS, overall survival.

could be elevated with radical resection. Local excision cannot achieve the same beneficial effect as radical treatment. For RNETs without lymph node metastasis and other high-risk factors (tumour size  $\geq 20$  mm, inherent muscle infiltration, distant organ metastases, etc.), radical resection does not appear to be a good choice. Local excision provides a comparable survival benefit to radical resection, and radical resection can lead to poor functional outcomes-even if patients receive sphincter-sparing surgery for rectal cancer, up to 90% have altered bowel habits (11). Additionally, a substantial number of patients have symptoms of abnormal defecation, such as urgent stools, frequent stools, and incontinence, which severely affects their quality of life (12,13). Therefore, the accurate prediction of lymph node metastasis before resection will provide guidance to clinicians and allow them to develop a treatment strategy that provides the best survival benefit and quality of life. This study not only revealed that tumour size ≥12 mm, T3/T4 stage and M1 stage were independently associated with the presence of lymph node metastasis but also was the first to established a nomogram with a good AUC (0.937) for the prediction of lymph node metastases. This model can help clinicians determine the best surgical strategies for RNET patients.

In a survival analysis of RNET patients, Feng *et al.* (6) found that TNM stage was an independent prognostic factor, Yu *et al.* (7) revealed that tumour grade was associated with survival outcomes, and Chagpar *et al.* (5) found that lymph node metastasis, distant metastasis, the depth of tumour invasion and tumour size were independent prognostic factors. All of the above elements should be taken into consideration by clinicians when evaluating RNET patient survival outcomes. Nomograms are simple graphical linear prediction models that can take

these variables into account and are widely used for the prediction of cancer patient prognosis. In this study, after comprehensive consideration of these influencing factors, we established a nomogram for the prediction of survival outcomes, including TNM stage (T: depth of tumour invasion; N: lymph node metastasis; M: distant metastasis), grade (differentiation, Ki-67 and mitotic rate per 10 highpower fields) and tumour size.

The nomograms constructed in this study consist of a competing risk nomogram for the CSS outcome and a nomogram for the OS outcome. The survival outcome of cancer patients may be affected by more than two events; however, only one event typically occurs (14). Competing risk events are events other than those of interest, which are censored in traditional survival analyses and may lead to overestimation of cumulative morbidity. Therefore, these events need to be modified by competitive risk analysis. We first established a competing risk model to reduce the influence of these outcomes. This competing risk nomogram model included grade, tumour size and AJCC TNM stage, which showed not only a good time-dependent AUC value and Brier score but also greater accuracy than that of the AJCC TNM stage classification. The possible effects arising from other lethal factors were eliminated by this simple nomogram, thus providing a reference for clinicians in practice. In addition to the competing risk nomogram model, this study also constructed a nomogram for OS outcomes. The OS outcome events included tumour-related death and nontumour-related death (such as cardiovascular disease, cerebrovascular disease and car accidents). Therefore, clinicians should consider not only the effect of tumour biological behaviour but also the effect of physical functions and economic statuses when considering the factors affecting survival. The variables

in our nomogram comprehensively considered the effect of the above factors, including age (physical condition), median income (economic factor) and TNM stage (tumour biological behaviour). Fields et al. (15) reported that old age was an unfavourable factor for OS outcomes in RNET patients based on a study of the NCDB database, which was consistent with our results. Older age is usually accompanied by poor physical function, decreased immunization and increased cardiovascular disease. The relationship between age and OS was expected to some extent. High-income patients tend to enjoy high-quality medical treatment and living conditions. The association between income and OS can be explained by these factors. The direct application of our prognostic nomograms to calculate risk scores may be a practical method to obtain personalized survival prediction for patients with RNETs.

This study has several limitations. First, we only used the SEER database to establish the prognostic models and lacked internal validation and external validation. Because only a small number of patients experienced cancer-specific death (12/1,253, 0.96%), lymph node metastases (23/1,253, 1.83%) and distant organ metastasis (14/1,253, 1.12%), dividing this sample set into a development model and a validation model would have introduced bias. Through accumulating more patients, we will verify our findings and further improve the RNET prognostic model by using a validation database in future. Second, it has been widely reported that the latest WHO classification [G1, G2, G3 and neuroendocrine carcinoma (NEC)] for NET was an important prognostic indicator. However, owing to the limitation of the SEER database, we were unable to obtain classification for the patients enrolled in this study. With advances in molecular and genetic detection techniques, genes and biomarkers have become promising factors to predict survival outcomes. However, biomarker data are not currently available in the SEER database, and more research is needed to explore the effects of these biomarkers on patient prognoses.

In conclusion, the present study established nomograms using a SEER database cohort, and the nomograms displayed comparatively better discrimination and accuracy for the prediction of lymph node metastases, CSS and OS. These nomograms can be used to guide tailored treatment strategies and predict individualized survival outcomes for patients with RNETs, which is helpful for improving prognostic assessments, enhancing patient stratification in clinical trials, and performing prognosis-based decisionmaking for individual RNET patients.

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## Footnote

*Reporting Checklist:* The authors have completed the TRIPOD reporting checklist. Available at https://jgo.amegroups.com/article/view/10.21037/jgo-21-573/rc

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*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). This study was based on a public SEER database and no personal identifying information was used in the study. Therefore, informed consent and institutional ethical approval was not required.

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