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50 **Abstract**  
(248 of 250 words)

**Background and purpose:** We externally validated a previously established multivariable normal-tissue complication probability (NTCP) model for Grade  $\geq 2$  acute esophageal toxicity (AET) after intensity-modulated (chemo-  
55 )radiotherapy or volumetric-modulated arc therapy for locally advanced non-small cell lung cancer.

**Materials and Methods:** A total of 603 patients from five cohorts (A-E) within four different Dutch institutes were included. Using the NTCP model, containing predictors concurrent chemoradiotherapy, mean esophageal dose,  
60 gender and clinical tumor stage, the risk of Grade  $\geq 2$  AET was estimated per patient and model discrimination and (re)calibration performance were evaluated.

**Results:** Four validation cohorts (A, B, D, E) experienced higher incidence of Grade  $\geq 2$  AET compared to the training cohort (49.3%-70.2% vs 35.6%;  
65 borderline significant for one cohort, highly significant for three cohorts). Cohort C experienced lower Grade  $\geq 2$  AET incidence (21.7%,  $p < 0.001$ ). For three cohorts (A-C), discriminative performance was similar to the training cohort (area under the curve (AUC) 0.81-0.89 vs 0.84). In the two remaining cohorts (D-E) the model showed poor discriminative power (AUC 0.64 and  
70 0.63). Reasonable calibration performance was observed in two cohorts (A-B), and recalibration further improved performance in all three cohorts with good

discrimination (A-C). Recalibration for the two poorly discriminating cohorts (D-E) did not improve performance.

**Conclusions:** The NTCP model for AET prediction was successfully validated in three out of five patient cohorts ( $AUC \geq 0.80$ ). The model did not perform well in two cohorts, which included patients receiving substantially different treatment. Before applying the model in clinical practice, validation of discrimination and (re)calibration performance in a local cohort is recommended.

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(3091 words)

## **Introduction**

Acute esophageal toxicity (AET) is frequently observed in locally advanced non-small cell lung cancer (LA-NSCLC) patients undergoing (chemo-  
85 )radiotherapy, particularly when patients receive concurrent chemotherapy [1, 2]. Normal-tissue complication probability (NTCP) models can help to estimate the risk of moderate or severe AET, which may be of benefit for anticipating events of hospitalization or treatment interruptions due to AET [3-7]. These multivariable NTCP models may also be used by doctors as a tool to support  
90 their decision on whether or not to treat at the cost of more AET [8-10]. Furthermore, in case there is an increased risk of AET, patients may be selected that benefit most from other radiotherapy techniques such as proton therapy [11, 12].

The vast majority of the reported NTCP models for AET are based on 3-  
95 dimensional conformal radiotherapy (3D-CRT) techniques. Intensity-modulated radiation therapy (IMRT) and volumetric-modulated arc therapy (VMAT), however, produce more conformal dose distributions at the cost of increased volumes receiving lower dose [13-16]. These differences may result in a different toxicity profile and thus require new NTCP models [17-19]. Therefore,  
100 the available NTCP models based on 3D-CRT may not be appropriate for AET risk prediction in patients treated with modern dose delivery techniques. We previously reported on an IMRT- and VMAT-based multivariable NTCP model

for Grade  $\geq 2$  AET [20]. This model was internally validated and the area under the receiver operating curve (AUC) was 0.84 (0.82 after correction for optimism) indicating good discriminative power of the model. Nonetheless, as reproducibility (model performance on new samples from the same target population), and transportability (model performance on samples from different but related populations) of well internally validated prediction models can still be poor, external validation is needed to assess ‘generalizability’ of the NTCP model to external patient cohorts [21-24].

In this study, we used five patient cohorts from four different Dutch institutes to externally validate the previously reported multivariable NTCP model for Grade  $\geq 2$  AET after IMRT or VMAT for LA-NSCLC (TRIPOD statement Type 4 external validation study [24]).

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## Materials and Methods

### *Established NTCP model for AET*

The model was developed using a training cohort of 149 LA-NSCLC patients who underwent (chemo-)radiotherapy using IMRT or VMAT at the Radboud  
120 University Medical Center (Nijmegen, The Netherlands) between March 2008 and June 2013. Information on treatment and patient selection has been previously described in more detail [20]. In brief, all patients received  $\geq 60$  Gy (median 66 Gy) in 2 Gy fractions (once daily), with or without (concurrent or sequential) chemotherapy (Table 1). The sequential chemotherapy regimen  
125 typically consisted of 3 (3-weekly) courses of gemcitabine/cisplatin, whereas all patients undergoing concurrent chemoradiotherapy (CCR) received 2 (3-weekly) courses of etoposide/cisplatin.

AET was scored weekly during treatment by the treating radiation oncologist using the Radiation Therapy Oncology Group (RTOG) acute radiation morbidity  
130 scoring criteria [25]. Toxicity scoring was continued after treatment until acute toxicity resolved. The AET scores were analysed in relation to clinical risk factors and radiation treatment plan derived dose volume histogram (DVH) parameters.

After multivariable logistic regression, with bootstrap sampling for model order  
135 and predictor selection, the following optimal NTCP model for Grade  $\geq 2$  AET (maximum at any timepoint) was established:

$$NTCP(\underline{x}) = \frac{1}{1+e^{-S(\underline{x})}} \quad (1)$$



with,

$$S(\underline{x}) = -6.418 + 2.645 \cdot CCR + 0.117 \cdot MED + 1.204 \cdot Gender + 0.994 \cdot cT, \quad (2)$$

140 and CCR = concurrent chemoradiotherapy (1 = yes, 0 = no), MED = mean esophageal dose (preferably first converting physical dose to linear-quadratic equivalent dose in 2 Gy fractions with  $\alpha/\beta = 10$  Gy using MED and its standard deviation [8, 26], or esophageal DVH or full dose matrix [27, 28]), gender (1 = female, 0 = male) and cT = clinical tumor stage ( $0 < cT3$ ,  $1 \geq cT3$ ).

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#### *External validation cohorts*

Five cohorts from four different Dutch institutes were available for validation of the abovementioned NTCP model. The patient, tumor and treatment characteristics of each cohort are listed in Table 1 and Supplementary Material  
150 Table S1. Except for cohort D and E, acute toxicity was retrieved retrospectively for these cohorts from the electronic health records. For all cohorts toxicity was scored weekly during radiotherapy and continued after radiotherapy until toxicity resolved, maximum AET score was used as outcome for model performance evaluation.

155 Cohort A ( $n=47$ ) was also treated in the Department of Radiation Oncology of the Radboud University Medical Center [20]. This cohort consisted solely of stage III NSCLC patients that were treated with (chemo-)radiotherapy using VMAT between June 2013 and December 2014. Radiotherapy and chemotherapy regimens and AET scoring were similar to those of the training

160 cohort. Cohort B ( $n=73$ ) consisted of stage III NSCLC patients which received  
(chemo-)radiotherapy at ‘Radiotherapiegroep’ (Arnhem, The Netherlands)  
between January 2014 and March 2016 using mostly VMAT. The radiotherapy  
regimen and AET scoring were similar to the training cohort. Sequential  
chemotherapy was platinum based, preferentially cisplatin. Concurrent  
165 chemotherapy consisted of 2 courses of platinum/etoposide sometimes preceded  
by one course of a platinum doublet with either etoposide, or pemetrexed.  
Cohort C consisted of 156 stage I-III NSCLC patients treated with (chemo-  
)radiotherapy at The Netherlands Cancer Institute (Amsterdam, The  
Netherlands) between December 1998 and March 2003 using 3D-CRT [29]. For  
170 27 patients, however, the predictor ‘clinical T-stage’ required in the NTCP-  
model was not available and therefore 129 patients with complete data were  
included. Varying radiotherapy schedules (total dose 49.5-94.5 Gy, 2.25-2.75  
Gy per fraction) were administered, and sequential and concurrent  
chemotherapy consisted of 2 courses of gemcitabine/cisplatin or daily low-dose  
175 cisplatin, respectively. The incidence of AET in this cohort has been evaluated  
and reported previously; AET was scored using the RTOG scoring criteria [29].  
Cohort D was also retrieved from The Netherlands Cancer Institute comprising  
172 patients treated between January 2008 and November 2010, and their AET  
was scored using the Common Toxicity Criteria Adverse Effects (CTCAE) v3.0  
180 [30]. See Table S2 in the Supplementary Material for a comparison between  
AET scoring using RTOG, CTCAE v3.0 and v4.0. These patients all underwent

concurrent chemoradiotherapy (daily low-dose cisplatin) using IMRT (66 Gy in 24 fractions) [31].

The patients from cohort E ( $n=398$ ) were treated at MAASTRO Clinic  
185 (Maastricht, The Netherlands) between April 2006 and October 2013. Of these, 216 patients had missing data, *i.e.*, missing mean esophageal dose ( $n=201$ , for technical reasons), AET score ( $n=4$ ; CTCAE v3.0 and v4.0 [32]), chemotherapy sequence ( $n=1$ ) and clinical T-stage ( $n=10$ ), and thus 182 patients were included. Patients received 1-3 courses of induction chemotherapy (gemcitabine or  
190 cisplatinum) typically followed by concurrent chemotherapy ( $n=156$ ) or sequential chemotherapy ( $n=24$ ) consisting of 2 courses of a platinum-based doublet. Two patients received no chemotherapy at all. The majority of patients ( $n=161$ ) received a total radiation dose of 69 Gy in 1.5 Gy fractions twice daily up to 45 Gy, followed by 8 to 24 Gy in 2 Gy once daily fractions, depending on  
195 the dose to the organs at risk (OAR) [33]. Eighteen patients were treated within the FDG-PET-based international multicenter Phase II dose escalation trial “PET-boost” [34]; they received 66 Gy in 24 once daily fractions to the gross tumor volume (GTV). In case dose escalation was possible (by increasing the fraction dose with equal number of fractions), an integrated boost was delivered  
200 to the primary tumor as a whole or to the volume of the primary tumor encompassed by 50% of the maximum standardized uptake value of FDG.

### *Statistical analysis*

Differences between the training cohort from which the NTCP model was developed and the validation cohorts were tested for statistical significance using the Mann-Whitney-U or Fisher's exact test, where appropriate (SPSS software, version 22.0; SPSS Inc., Chicago, USA). A  $p$ -value of  $<0.05$  was considered statistically significant.

### 210 *Model performance*

The risk of Grade  $\geq 2$  AET was calculated for each individual patient by applying the original NTCP model (Formula 1 and 2). The discriminative power of the model for the validation cohorts was assessed by calculating the area under the curve (AUC) of the receiver operating characteristic (ROC). The criterion for successful external validation was  $AUC \geq 0.80$ , *i.e.*, no significant deterioration of model performance with respect to the training cohort (AUC 0.84, or 0.82 after optimism correction [20]). Furthermore, the discrimination slopes were calculated by the absolute difference between the mean predicted risk of the groups with and without Grade  $\geq 2$  AET.

220 Model calibration performance was assessed by calibration plots displaying grouped observed frequencies versus predicted outcome [35]. A loess smoother was plotted, which approximates the  $y=x$  identity line in case of good calibration [36]. The 95% confidence intervals of the binomially distributed grouped frequencies were calculated according to the Wilson interval [37]. Double

225 histograms of predicted probabilities for patients with and without Grade  $\geq 2$   
AET were also generated for the calibration plots.

To assess possible miscalibration in the cohorts, the method of logistic  
recalibration was applied [38, 39]. The linear predictors for each patient, *i.e.*, the  
calculated results after inserting patient specific parameters into Formula 2, were  
230 used as a single predictor in a new logistic regression model according to:

$$NTCP(\underline{x}) = \frac{1}{1+e^{-S'(\underline{x})}} \quad (3)$$

with updated linear predictor

$$S'(\underline{x}) = a + b \cdot S(\underline{x}). \quad (4)$$

The resulting calibration intercept  $a$  ('calibration-in-the-large') compares the  
235 mean of the predicted risks with the mean of the observed risk and gives an  
indication whether predictions are systematically under- ( $a > 0$ ) or overestimated  
( $a < 0$ ). The calibration slope  $b$  indicates the level of overfitting ( $b < 1$ ), *i.e.*, the  
predictions are too extreme, or underfitting ( $b > 1$ ), the predictions are too mild.  
Recalibration does neither affect sensitivity nor specificity and thus ROC and  
240 AUC both remain the same [21, 35].

The overall performance of the recalibrated models in each cohort was  
additionally assessed by calculation of the scaled Brier score, a quadratic scoring  
rule corrected for dependence on the incidence of the outcome [21].  
Additionally, Nagelkerke's  $R^2$  was calculated, which is a logarithmic scoring  
245 rule to express the amount of variance in the dependent variables explained by  
the model [39, 40].

## Results

### *Comparison of cohorts*

250 A comparison of training and validation cohort characteristics for the NTCP model predictors and AET is listed in Table 1. The incidence of Grade  $\geq 2$  AET in cohorts A, D and E was (nearly) twice the incidence of Grade  $\geq 2$  AET in the training cohort (70.2%, 59.3% and 68.1% vs 35.6%, respectively;  $p < 0.001$ ). The patients in cohort C experienced lower rates of Grade  $\geq 2$  AET compared to the  
255 training cohort (21.7% vs 35.6%, respectively;  $p = 0.01$ ). Other patient, tumor and treatment characteristics of the cohorts are listed as Supplementary Material in Table S1.

### *Model performance*

260 A summary of model performance in the validation cohorts, *i.e.*, overall performance, discrimination and (re)calibration, is listed in Table 2. Unsurprisingly, the best performance, as indicated by the highest value of the scaled Brier and Nagelkerke  $R^2$ , was seen in the training cohort. The overall performance was high for cohorts A, B and C, but was poor for cohorts D and E.  
265 The ROC curves for all cohorts are displayed in Figure 1. High discriminative performance of similar quality to the training cohort was obtained for cohorts A, B and C, as indicated by high AUCs (0.89, 0.81 and 0.84, respectively). Poor discrimination of the model was found in cohort D and E (AUC 0.64 and 0.63

respectively). This poor discrimination performance is also demonstrated by the  
270 calculated discrimination slopes (Table 2).

Model calibration performance, without recalibration, can be visually assessed  
from the calibration plots shown in Figure S1 of the Supplementary Material.  
Reasonable performance without recalibration was found by the model for  
cohorts A and B, demonstrated by the loess smoother which was relatively close  
275 to the identity line. The model generally underestimated the risk of Grade  $\geq 2$   
AET. Increasingly poor calibration was observed for cohorts C, D and E.

Calibration plots generated after recalibration are shown in Figure 2, and the  
values for the calibration-in-the-large and calibration slope are listed in Table 2.  
For cohorts A and B, good calibration was achieved after recalibration.  
280 Similarly, for cohort C recalibration moderately improved the agreement  
between predicted and observed risk. For cohorts D and E, calibration did not  
improve after recalibration, indicated by the limited range of predicted  
probabilities (see Figure 2).

285

## Discussion

Recently, we established a multivariable NTCP model for AET in LA-NSCLC undergoing IMRT or VMAT and after thorough internal validation the model proved to be robust [20]. However, it is of paramount importance to perform external validation in order to ensure that the model is transportable to other patient cohorts [21, 23]. This means that the model produces accurate predictions in a sample that was drawn from a different but plausibly related population. Several components of ‘transportability’ can be distinguished, such as historical (*e.g.*, a different time period), geographical (*e.g.*, treated in a different hospital) and methodological (*e.g.*, differences in toxicity scoring) transportability [41]. To account for all these components of transportability, we externally validated our previously established NTCP model for Grade  $\geq 2$  AET in cohorts of (LA-)NSCLC patients that were treated by (chemo-)radiotherapy in different hospitals (cohort B-E), receiving different radiation fractionation schedules (cohort C-E) and in a historically different period of time with less conformal dose delivery techniques (cohort C). Ideally, an NTCP model performs well in every patient cohort external to the cohort the model was developed on. However, this so-called ‘strong calibration’ is only considered possible in utopia [35]. Therefore, applying an established NTCP model in different patient cohorts often needs some form of adjustments to account for local circumstances [42, 43].



Recalibration is a controlled form of model updating; *i.e.*, the coefficients of the model are adjusted to correct for differences in for instance event rates. Initial calibration of the model in cohort A and B was moderate (see Figure S1 in the  
310 Supplementary Material). Underestimation of Grade  $\geq 2$  AET was seen, which is possibly due to a lower incidence of Grade  $\geq 2$  AET in the training cohort (35.6%) compared to cohort A (70.2%) and cohort B (49.3%). The class imbalance in the training cohort can affect the estimate of the model intercept and skews the predicted probabilities. After recalibration of the NTCP model for  
315 cohort A and B, calibration improved (see Figure 2). Discrimination of the model was good for the patients in cohort A and B (AUC 0.89 and 0.81, respectively). Formerly, we hypothesized that differences in dose delivery techniques influenced NTCP modelling since the models based on 3D-CRT did not perform well in head and neck cancer patients who underwent IMRT [18,  
320 20, 44, 45]. Although cohort C differs substantially from the training cohort regarding treatment technique (3D-CRT *vs* IMRT/VMAT), radiation dose (49.5-94.5 Gy *vs* 66 Gy), the application of concurrent chemotherapy, and the time period (1998-2003 *vs* 2008-2010), the current model performed surprisingly well for this population (AUC 0.84 with a moderately good recalibration curve).  
325 Cohorts D and E showed poor discrimination (AUC 0.64 and 0.63 respectively) and (re)calibration (see Figure 1 and Supplementary Material Figure S1). Re-estimating the regression coefficients or adding additional predictors that are known for their association with AET (for example, overall treatment time

(OTT) and chemotherapy regimen; see below) are approaches to improve model  
330 predictions. Besides this, there may be several other reasons for the poor model  
performance in these cohorts. Firstly, the NTCP model was developed using the  
RTOG grading scale for AET. However, toxicity for the patients in cohort D and  
E was scored using the CTCAE grading scales for AET. Differences between  
scoring systems were reported to be of importance in modelling of toxicity, for  
335 instance for modelling the risk of radiation-induced pneumonitis [46]. It is likely  
that such differences in grading scales affect AET modelling as well. This was  
illustrated for the patients of cohort B for whom both the RTOG and CTCAE  
v4.0 grading of AET were available. Applying the NTCP model using the  
CTCAE-based AET scores resulted in a high discrimination with AUC of 0.80  
340 (compared to 0.81 for the RTOG based scores), however, model calibration was  
poor since it considerably underestimated the risk of CTCAE Grade  $\geq 2$  AET  
(data not shown). The latter can be explained by the finding that in 35.6% of the  
patients AET was scored as Grade 1 using the RTOG scale and as Grade 2 using  
the CTCAE scale (see Table S2 in the Supplementary Material). Secondly, the  
345 patients from cohort D received concurrent chemoradiotherapy in a  
fundamentally different protocol compared to the patients in the training cohort  
as they received daily low-dose cisplatin and moderately hypofractionated  
radiotherapy schedules. Thirdly, the OTT is shorter for cohort D and E (5  
weeks) than for the training cohort (6.5 weeks). Besides, the majority of patients  
350 (88.5%) from cohort E were treated twice-daily. Both factors are known to result

in a strong increase of AET [3, 6]; including OTT in the NTCP model for patients receiving treatment with a shorter OTT is likely to improve model performance for these cohorts as reported by Dehing-Oberije et al. [3].

Despite our aim to thoroughly validate the established NTCP model for Grade  
355  $\geq 2$  AET by assessing the transportability of the model using multiple different patient cohorts, some potential limitations should be noted. Firstly, the data of most cohorts were retrieved retrospectively (except cohort D and E) possibly introducing unwanted bias. Furthermore, for some patients of the validation cohorts the necessary NTCP model predictor values could not be retrieved  
360 resulting in exclusion of these patients. The number of patients of the separate cohorts may be considered low for model validation, however, the total number of patients ( $n=603$ ) included in the validation cohorts is substantial. For future work, by making data ‘smarter’, *e.g.*, by implementing semantic technologies [47, 48], and more easily accessible, by adhering to the FAIR data principles  
365 [49], distributed learning techniques can allow training and validation of models in much larger cohorts of patients that were not treated according to any specific study protocol [50]. Finally, this study is an external validation of a model previously published by us and we therefore encourage independent external validation by other research groups.

370 In conclusion, the established NTCP model for the prediction of Grade  $\geq 2$  AET in patients treated for locally advanced NSCLC successfully validated in 3 out of 5 patient cohorts, but performed poor in 2 cohorts that were significantly

different for many variables. Before implementing the NTCP model in clinical practice, one should always check model discrimination and calibration performance in a local cohort representative of the patients for which the model is intended to be used in the future. If good discrimination but poor calibration is observed a local recalibration of the model is advised. After implementation the model should be evaluated over time for new patients since treatments and cohorts change and model performance can deteriorate to the point where the model coefficients need to be updated or additional predictors may become relevant and complete remodelling is necessary.

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**Table 1.** Comparison of validation cohort characteristics with the training cohort for the NTCP model predictors and AET.

NTCP model predictors	Training cohort		Validation cohorts										
	n=149	A n=47	p	B n=73	p	C n=129	p	D n=172	p	E n=182	p	A-E† n=603	p
<i>Gender (%)</i>													
Male	97 (65.1)	18 (38.3)		38 (52.1)		88 (68.2)		102 (59.3)		113 (62.1)		359 (59.5)	
Female	52 (34.9)	29 (61.7)	<b>0.002</b>	35 (47.9)	0.08	41 (31.8)	0.61	70 (40.7)	0.30	69 (37.9)	0.65	244 (40.5)	0.65
<i>T-stage (%)</i>													
≤2	75 (50.3)	21 (44.7)		24 (32.9)		62 (48.1)		91 (52.9)		78 (42.9)		276 (45.8)	
≥3	74 (49.7)	26 (55.3)	0.51	49 (67.1)	<b>0.02</b>	67 (51.9)	0.72	81 (47.1)	0.66	104 (57.1)	0.19	327 (54.2)	0.19
<i>Chemotherapy (%)</i>													
Concurrent	93 (62.4)	33 (70.2)		45 (61.6)		25 (19.4)		172 (100.0)		156 (85.7)		431 (71.5)	
Sequential/none	46/10 (37.6)	12/2 (29.8)	0.38	24/4 (38.4)	1.00	31/73 (80.6)	<b>&lt;0.001</b>	-	<b>&lt;0.001</b>	24/2 (14.3)	<b>&lt;0.001</b>	91/81 (28.5)	<b>&lt;0.001</b>
<i>D<sub>mean</sub> esophagus in Gy</i>													
Median physical dose (IQR)	25.2 (20.5-31.0)	28.8 (22.2-34.1)	0.06	26.5 (23.3-32.7)	0.16	-	-	-	-	20.0 (14.9-27.9)	<b>&lt;0.001</b>	25.5 (17.5-32.7)	0.72
Median EQD2 <sub>α/β=10</sub> (IQR)	24.0 (19.6-30.1)	-	-	-	-	24.1 (10.6-33.3)	0.20	30.1 (23.7-36.5)	<b>&lt;0.001</b>	-	-	-	-
<i>Grade ≥2 AET</i>													
RTOG	53 (35.6)	33 (70.2)	<b>&lt;0.001</b>	36 (49.3)	0.06	28 (21.7)	<b>0.01</b>	-	-	-	-	323 (53.6)	<b>&lt;0.001</b>
CTCAE*	-	-	-	62 (84.9)	<b>&lt;0.001</b>	-	-	102 (59.3)	<b>&lt;0.001</b>	124 (68.1)	<b>&lt;0.001</b>	-	-
<i>Grade ≥3 AET</i>													
RTOG	13 (8.7)	10 (21.3)	<b>0.03</b>	12 (16.4)	0.11	7 (5.4)	0.36	-	-	-	-	124 (20.6)	<b>&lt;0.001</b>
CTCAE*	-	-	-	13 (17.8)	0.07	-	-	40 (23.3)	<b>&lt;0.001</b>	55 (30.2)	<b>&lt;0.001</b>	-	-

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*Abbreviations:* NTCP = normal-tissue complication probability; AET = acute esophageal toxicity; D<sub>mean</sub> = mean dose; IQR = interquartile range; EQD2<sub>10</sub> = equivalent dose in 2 Gy fractions with α/β = 10 Gy;

RTOG = Radiation Therapy Oncology Group; CTCAE = Common Toxicity Criteria Adverse Effects; N/A = not applicable.

The p-values are calculated for the comparison between the validation cohort and the training cohort (Mann-Whitney-U or Fisher's exact test where appropriate). Bold p-values are statistically significant.

\*p-values of AET scoring using CTCAE are calculated with respect to the training cohort AET scoring that used RTOG.

†The combined cohort A-E has a mixture of physical and equivalent mean esophageal dose, and a mixture of RTOG and CTCAE-based toxicity scores.



**Table 2.** Performance of the NTCP model after recalibration for the different patient cohorts.

Performance measure	Training cohort	Validation cohort					
	n=149	A n=47	B n=73	C n=129	D n=172	E n=182	A-E n=603
<i>Pseudo R<sup>2</sup>s</i>							
Brier <sub>scaled</sub>	0.35	0.44	0.31	0.24	0.06	0.05	0.19
Nagelkerke	0.41	0.55	0.38	0.36	0.08	0.06	0.24
<i>Discrimination</i>							
AUC (95% CI)	0.84 (0.77-0.91)	0.89 (0.80-0.98)	0.81 (0.70-0.91)	0.84 (0.75-0.94)	0.64 (0.55-0.72)	0.63 (0.55-0.71)	0.74 (0.70-0.78)
SE	0.04	0.05	0.05	0.05	0.04	0.04	0.02
Discrimination slope	0.33	0.45	0.30	0.25	0.06	0.05	0.19
<i>Calibration</i>							
Calibration-in-the-large	0.00	1.18	0.20	-0.15	-0.22	1.63	0.57
Calibration slope	1.00	1.36	0.71	0.60	0.40	0.29	0.50

*Abbreviations:* NTCP = normal-tissue complication probability; AUC = area under the curve; CI = confidence interval; SE = standard error.

## Figure Legends

540 **Figure 1.** ROC curves of the previously published NTCP model [20] applied on all patient cohorts showing good discriminating performance for 3 out of 5 validation cohorts as indicated by AUC values ( $>0.80$ ).

Abbreviations: ROC = receiver operating characteristic; NTCP = normal-tissue complication probability; AUC = area under the curve.

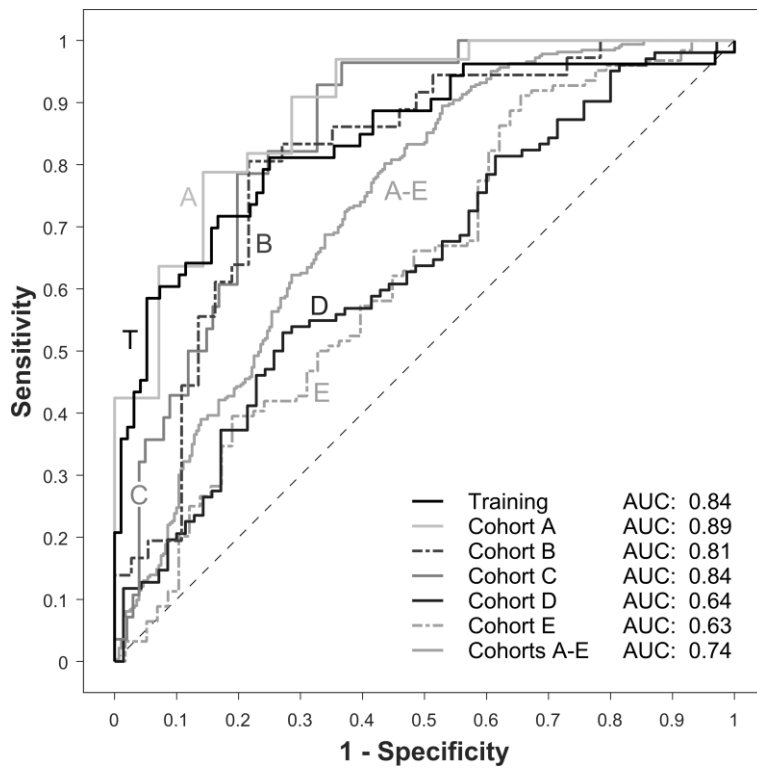
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**Figure 2.** Calibration plots of the NTCP model applied on all validation cohorts separate and combined, after recalibration per cohort. Recalibrated predicted probabilities are calculated by inserting the cohort-specific calibration-in-the-large and calibration slope values in Formulas 3 and 4. The triangles indicate grouped predicted probabilities of Grade  $\geq 2$  AET vs grouped observed frequencies. The vertical lines represent 95% confidence intervals. A loess smoother was fitted and displayed by the black line. Perfect predictions should be close to the dashed  $45^\circ$  reference line. Double histograms of patients with and without Grade  $\geq 2$  AET, binned according to their predicted probabilities, are displayed at the bottom.

Abbreviations: NTCP = normal-tissue complication probability; AET = acute esophageal toxicity; AUC = area under the curve.

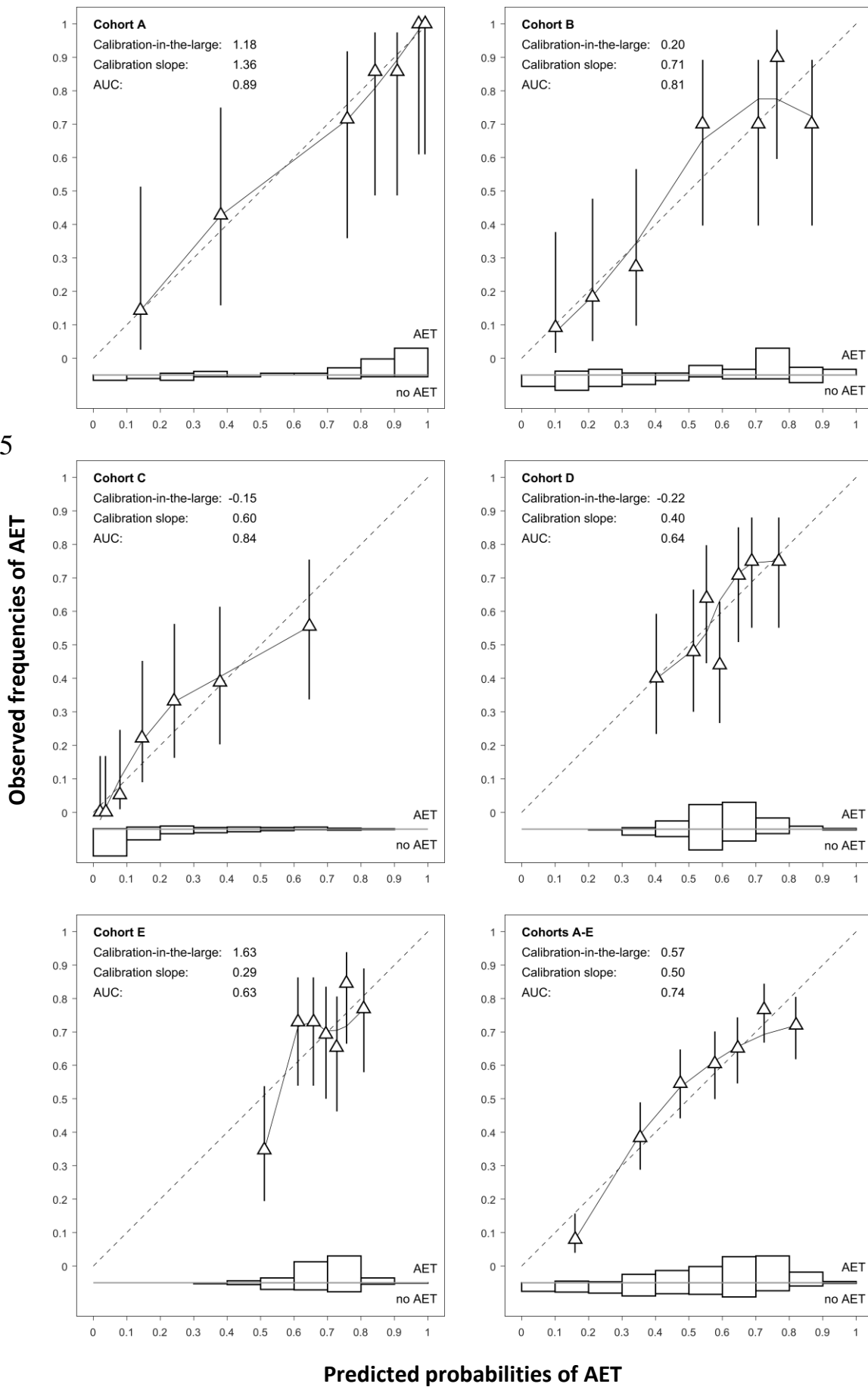
**Figure 1.** Receiver operating characteristic curves for the NTCP model on all

560 patient cohorts.



**Figure 2.** Recalibrated calibration plots of the NTCP model on all cohorts.

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## Supplementary Material

**Table S1.** Patient, tumor and treatment characteristics for the training and validation cohorts.

Characteristics	Training cohort		Validation cohorts										
	n=149	A n=47	p	B n=73	p	C n=129	p	D n=172	p	E n=182	p	A-E n=603	p
<i>Age (y) (range)</i>													
Median	63 (36-78)	65 (46-82)	0.35	68 (45-85)	<b>0.003</b>	70 (31-88)	<b>&lt;0.001</b>	63 (38-85)	0.33	64 (38-87)	0.08	66 (31-88)	<b>0.002</b>
<i>Performance (%)</i>													
KS ≥90 or WHO ≤1	95 (63.8)	32 (68.1)		54 (74.0)		77 (59.7)		148 (86.0)		162 (89.0)		473 (78.4)	
KS ≤80 or WHO ≥2	54 (36.2)	15 (31.9)		19 (26.0)		8 (6.2)		24 (14.0)		19 (10.4)		85 (14.1)	
Missing	-	-	0.73	-	0.17	44 (34.1)	<b>&lt;0.001</b>	-	<b>&lt;0.001</b>	1 (0.5)	<b>&lt;0.001</b>	45 (7.5)	<b>&lt;0.001</b>
<i>Tumor cell type (%)</i>													
SCC	56 (37.6)	17 (36.2)		29 (39.7)		N/A		63 (36.6)		53 (29.1)		162 (26.9)	
AC	59 (39.6)	24 (51.1)		34 (46.6)		N/A		36 (20.9)		58 (31.9)		152 (25.2)	
NSCLC undefined	22 (14.8)	1 (2.1)		5 (6.8)		N/A		71 (41.3)		63 (34.6)		140 (23.2)	
Other/Missing	6/6 (4.0/4.0)	5/0 (10.6/-)	<b>0.02</b>	3/2 (4.1/2.7)	0.50	N/A/129 (-/100.0)	N/A	0/2 (-/1.2)	<b>&lt;0.001</b>	8/0 (4.4/-)	<b>&lt;0.001</b>	16/133 (2.7/22.1)	<b>&lt;0.001</b>
<i>Clinical Stage (%)</i>													
I	-	-		-		34 (26.4)		1 (0.6)		-		35 (5.8)	
II	2 (1.3)	-		-		18 (14.0)		16 (9.3)		-		34 (5.6)	
IIIa	94 (63.1)	24 (51.1)		35 (47.9)		26 (20.2)		100 (58.1)		92 (50.5)		277 (45.9)	
IIIb	53 (35.6)	23 (48.9)		38 (52.1)		51 (39.5)		45 (26.2)		83 (45.6)		240 (39.8)	
IV	-	-		-		-		-		7 (3.8)		7 (1.2)	
Missing	-	-	0.21	-	<b>0.04</b>	-	<b>&lt;0.001</b>	10 (5.8)	<b>&lt;0.001</b>	-	<b>0.002</b>	10 (1.7)	<b>&lt;0.001</b>
<i>N-stage (%)</i>													
0/1/X	20 (13.4)	2 (4.3)		10 (13.7)		69 (53.5)		49 (28.5)		31 (17.0)		161 (26.7)	
2	92 (61.7)	29 (61.7)		41 (56.2)		54 (41.9)		102 (59.3)		96 (52.7)		322 (53.4)	
3	37 (24.8)	16 (34.0)	0.15	22 (30.1)	0.68	6 (4.7)	<b>&lt;0.001</b>	21 (12.2)	<b>&lt;0.001</b>	55 (30.2)	0.26	120 (19.9)	<b>0.002</b>
<i>Radiation dose (%)</i>													
<60 Gy	-	-		-		1 (0.8)		-		53 (29.1)		54 (9.0)	
60-65.9 Gy	4 (2.7)	3 (6.4)		13 (17.8)		4 (3.1)		-		36 (19.8)		56 (9.3)	
66 Gy	145 (97.3)	44 (93.6)		60 (82.2)		-		172 (100.0)		7 (3.8)		283 (46.9)	
66.1 - 80 Gy	-	-		-		28 (21.7)		-		83 (45.6)		111 (18.4)	
>80 Gy	-	-		-		54 (41.9)		-		3 (1.6)		57 (9.5)	
Missing	-	-	0.36	-	<b>&lt;0.001</b>	42 (32.6)	<b>&lt;0.001</b>	-	0.05	-	<b>&lt;0.001</b>	42 (7.0)	<b>&lt;0.001</b>
<i>Technique (%)</i>													
IMRT	99 (66.4)	-		1 (1.4)		-		172 (100.0)		107 (58.8)		280 (46.4)	
VMAT	50 (33.6)	47 (100.0)		72 (98.6)		-		-		-		119 (19.7)	
3D-CRT	-	-		-		129 (100.0)		-		-		129 (21.4)	
Unknown	-	-	<b>&lt;0.001</b>	-	<b>&lt;0.001</b>	-	<b>&lt;0.001</b>	-	<b>&lt;0.001</b>	75 (41.2)	<b>&lt;0.001</b>	75 (12.4)	<b>&lt;0.001</b>
<i>PTV volume (cm<sup>3</sup>)</i>													
Median (IQR)	480 (358-629)	524 (281-664)	0.69	500 (349-681)	0.63	N/A	N/A	N/A	N/A	N/A	N/A	515 (340-673)	0.58

*Abbreviations:* KS = Karnofsky performance score; WHO = World Health Organization performance score; SCC = squamous cell carcinoma; AC = adenocarcinoma; NSCLC = non-small cell lung cancer; IMRT = intensity-modulated radiation therapy; VMAT = volumetric-modulated arc therapy; 3D-CRT = 3-dimensional conformal radiotherapy; PTV = planning target volume; IQR = interquartile range; N/A = not available. Bold p-values are statistically significant.

The p-values are calculated for the comparison between the validation cohort and the training cohort (Mann-Whitney-U or Fisher-Freeman-Halton exact test where appropriate). Bold p-values are statistically significant.

**Table S2.** Comparison of RTOG and CTCAE scoring criteria for acute esophageal toxicity (esophagitis and dysphagia).

System	Organ tissue/ system organ class	Adverse event	Grade			
			1	2	3	4
RTOG [25]	Pharynx & esophagus	Dysphagia or odynophagia	Mild dysphagia or odynophagia; may require topical anesthetic or non- narcotic analgesics; may require soft diet	Moderate dysphagia or odynophagia; may require narcotic analgesics; may require puree or liquid diet	Severe dysphagia or odynophagia with dehydration or weight loss >15% from pretreatment baseline) requiring NG feeding tube, IV fluids or hyperalimentation	Complete obstruction, ulceration, perforation, fistula
CTCAE v3.0 [27]	Gastrointestinal	Dysphagia	Symptomatic, able to eat regular diet	Symptomatic and altered eating/swallowing (e.g., altered dietary habits, oral supplements); IV fluids indicated <24 hrs	Symptomatic and severely altered eating/swallowing (e.g., inadequate oral caloric or fluid intake); IV fluids, tube feedings, or TPN indicated ≥24 hrs	Life-threatening consequences (e.g., obstruction, perforation)
CTCAE v3.0	Gastrointestinal	Esophagitis	Asymptomatic pathologic, radiographic, or endoscopic findings only	Symptomatic; altered eating/swallowing (e.g., altered dietary habits, oral supplements); IV fluids indicated <24 hrs	Symptomatic and severely altered eating/swallowing (e.g., inadequate oral caloric or fluid intake); IV fluids, tube feedings, or TPN indicated ≥24 hrs	Life-threatening consequences
CTCAE v4.0 [29]	Gastrointestinal	Dysphagia	Symptomatic, able to eat regular diet	Symptomatic and altered eating/swallowing	Severely altered eating/swallowing; tube feeding or TPN or hospitalization indicated	Life-threatening consequences; urgent intervention indicated
CTCAE v4.0	Gastrointestinal	Esophagitis	Asymptomatic; clinical or diagnostic observations only; intervention not indicated	Symptomatic; altered eating/swallowing; oral supplements indicated	Severely altered eating/swallowing; tube feeding, TPN or hospitalization indicated	Life-threatening consequences; urgent operative intervention indicated

*Abbreviations:* RTOG = Radiation Therapy Oncology Group; CTCAE = Common Toxicity Criteria Adverse Effects; NG = nasogastric; IV = intravenous; TPN = total parenteral nutrition. RTOG organ tissues are listed under table “RTOG acute radiation morbidity scoring criteria”. Not shown: RTOG specifies Grade 0 as “No change over baseline”, CTC specifies Grade 5 as “Death”.

## Figure legends

**Figure S1.** Calibration plots of the NTCP model applied on all validation cohorts separate and combined, without recalibration (calibration-in-the-large and calibration slope are given but not applied). The triangles indicate grouped predicted probabilities of Grade  $\geq 2$  AET vs grouped observed frequencies. The vertical lines represent 95% confidence intervals. A loess smoother is fitted and displayed by the black line. Perfect predictions should be close to the dashed 45° reference line. Double histograms of patients with and without Grade  $\geq 2$  AET, binned according to their predicted probabilities, are displayed at the bottom.

Abbreviations: NTCP = normal-tissue complication probability; AUC = area under the curve; AET = acute esophageal toxicity.

**Figure S1.** Calibration plots of the NTCP model applied on all cohorts.

