



## ORIGINAL ARTICLE

# Periodontal risk score: Initiation and model validation for 6,762 teeth

Muhammad H. A. Saleh<sup>1</sup> | Mustafa Tattan<sup>2</sup> | Giuseppe Troiano<sup>3</sup> |  
Himabindu Dukka<sup>4</sup> | Andrea Ravidà<sup>5</sup> | Robert Levine<sup>6</sup> | Hom-Lay Wang<sup>1</sup> |  
Preston D. Miller<sup>7</sup>

<sup>1</sup>Department of Periodontics and Oral Medicine, University of Michigan School of Dentistry, Ann Arbor, Michigan, USA

<sup>2</sup>Department of Periodontics, University of Iowa College of Dentistry, Iowa City, Iowa, USA

<sup>3</sup>Department of Clinical and Experimental Medicine, University of Foggia, Foggia, Italy

<sup>4</sup>Department of Periodontics, University of Louisville School of Dentistry, Louisville, Kentucky, USA

<sup>5</sup>Department of Periodontics & Oral Medicine, University of Pittsburgh, Pittsburgh, Pennsylvania, USA

<sup>6</sup>Department of Periodontics, Temple University, Kornberg School of Dentistry, Philadelphia, Pennsylvania, USA

<sup>7</sup>Department of Periodontics, Medical University of South Carolina, Charleston, South Carolina, USA

## Correspondence

Hom-Lay Wang, D.D.S., M.S.D., Ph.D., Professor and Director of Graduate Periodontics, Department of Periodontics and Oral Medicine, University of Michigan, School of Dentistry, 1011 North University Ave., Ann Arbor, MI 48109-1078, USA.  
Email: [homlay@umich.edu](mailto:homlay@umich.edu)

## Abstract

**Background:** Tooth-level prognostic systems are valuable tools for treatment planning and risk assessment of periodontally involved teeth. Recently the Miller–McEntire prognosis index was found to outperform comparable systems. However, it had some limitations. The present study aimed to develop and evaluate the prognostic performance of a modified version that addresses most limitations of the previous model called the periodontal risk score (PRS).

**Methods:** Data were retrieved retrospectively from patients who received surgical and non-surgical periodontal treatment at a university setting. Data on medical history and smoking status at baseline and the last maintenance visit were collected. Both univariate and multivariate Cox proportional hazard regression models were used to analyze the prognostic capability for predicting tooth loss due to periodontitis (TLP) risk.

**Results:** A total of 6762 teeth (281 patients) were followed up for a mean period of  $22.6 \pm 6.34$  (10–47.6y) years. The PRS was successfully able to stratify the risk of TLP at baseline when the three different classes of association were compared for anterior and/or posterior tooth loss. After controlling for maintenance, age, and sex, the index showed an excellent predictive capacity for TLP with a Harrell C-index of 0.947.

**Conclusions:** The periodontal risk score (PRS) displayed excellent predictive capability for anterior as well as posterior tooth loss due to periodontitis. This system was able to predict long-term tooth loss with a very high accuracy in a population treated mainly by dental students and periodontics residents. The use of this/similar prognosis system is advisable as a means to establish tooth prognosis.

## KEYWORDS

attachment loss, periodontal, periodontitis, risk factor assessment, tooth loss, validation study

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## 1 | INTRODUCTION

Periodontal risk assessment and prognosis systems are valuable tools to gauge if periodontally compromised teeth are salvageable short- and long-term. When performed accurately, their inclusion helps to customize patient management, provide less invasive treatment plans, and reduced long-term costs.<sup>1</sup> Contrary to diagnosis which conveys identifying disease status, risk assessment predicts the likelihood of disease progression. Risk assessment has the potential to adjust the traditional model of care (diagnosis > treatment > maintenance; regardless of the risk for future progression or developing new disease). Instead, a wellness model of care emphasizes prevention, weighing treatment benefit and guided reduction of risk factors in addition to treatment.<sup>2,3</sup>

Although numerous tools exist, there is no single universally accepted system or even set of criteria for periodontal prognosis.<sup>4</sup> As far as we know, only one study attempted to validate these systems prospectively,<sup>5</sup> but recently, 10 commonly used tooth-level prognostic systems were retrospectively validated and compared in terms of their predictive capacity for tooth loss.<sup>6</sup> All compared systems were able to effectively predict tooth loss. What is more, is that one specific tooth-prognosis system seemed to outperform all other systems regardless of the nature of analyses, confounders or type of tooth-loss (periodontal versus overall tooth loss) considered.<sup>6</sup> That system was found to be the Miller–McEntire Periodontal Prognostic Index (MMPPI).<sup>7</sup>

One main disadvantage of that index is the time required to execute the prognostication is more than most other systems. However, if the clinician thinks the extra time required is not worth the increased predictive value, it is strongly recommended that another system still be used. Currently, several universities like University of Michigan and University of Louisville, are using this system to determine the survival of specific teeth in more complex interdisciplinary treatment planning cases, whenever the decision of retaining a tooth is uncertain. This seems particularly useful since it gives a fairly accurate estimation of the 5–10, 10–20, and 20–30 year survival. This is hence useful for getting the patient involved in the treatment plan for deciding which teeth can be retained. We are currently studying the possibility of adding the score to patient's electronic health records, where based on the information entered for each tooth, a PRS score is generated automatically, similar to what is currently achieved for clinical attachment loss.

Although showing promising results when internally and externally validated, this index has several limitations that needed to be addressed first before recommendations are made for using on a wide scale.<sup>6</sup> This index has undergone several modifications to accommodate the significance of environmental factors.<sup>8</sup> In the modified ver-

sion of the MMPPI, hemoglobin A1c (HbA1c) levels instead of binary (diabetic/non-diabetic) records were required. Cigarette consumption was changed into never, former, current light, or current heavy smokers.<sup>9</sup> Finally, instead of 11 classes, the modified version, called the periodontal risk score (PRS) has only three classes; (1 = excellent prognosis; 2 = good prognosis; and 3 = guarded prognosis). Figure 1 shows the modified version of the MMPPI.

If such modified score was proven to be predictable, a prospective study to validate will be the next rationale step before investing in implementing in dental schools and private practices. Hence, the aim of this study was to introduce and validate a new modified version of the MMPPI (PRS) which resolves issues like applicability to front teeth, decreasing the number of classes and emphasizing the role of environmental and systemic factors. Validation of PRS will be in terms of its categorical predictive capability for the risk of periodontal tooth loss (TLP) and prediction of tooth survival over long-term follow-up and contrasting that to the original MMPPI.

## 2 | MATERIALS AND METHODS

This study was conducted in agreement with the Helsinki Declaration of 1975 (World Medical Association, 1975) as most recently revised in 2013 (World Medical Association, 2013). The study was also approved by the University of Michigan Medical School Institutional Review Board (identifier number: HUM00157260). This observational study followed the Strengthening the Reporting of Observational Studies in Epidemiology (STROBE) guidelines during the preparation of the manuscript. The Transparent Reporting of a Multivariable Prediction Model for Individual Prognosis or Diagnosis (TRIPOD) statement was also taken as a reference for validation of this model.<sup>10</sup>

### 2.1 | Study population

The present data were extracted from the electronic and paper charts for patients receiving periodontal treatment at the Periodontics and Oral Medicine department between January 1966 and January 2010 at the University of Michigan School of Dentistry, Ann Arbor, Michigan, United States. The complete data of 340 patients with 7924 teeth were included in the analysis.

### 2.2 | Patient selection criteria

- Patients who have had the active therapy for periodontitis (either surgically or non-surgically) at the University of Michigan School of Dentistry.





- Patients with diabetes not reporting HbA1c and/or plasma glucose levels at the baseline visits; if a patient only reported plasma glucose levels; or their scores were converted to HbA1c percentage using estimated average glucose levels.<sup>13,14</sup>

### 2.3 | Data collection and patient classification

Records of the patients were screened and evaluated by two examiners (HD and MS). If patient data were acceptable for the pre-set inclusion criteria, all patient-level factors (age, sex, history of smoking, systemic conditions, etc.), as well as frequency of PMT (number of visits/year), were collected. Tooth- and site-level information such as PD, clinical attachment level (CAL), BOP, tooth mobility, furcation involvement, number of furcations involved,<sup>7</sup> and keratinized tissue width were collected from patient charts at T0 (time of active periodontal therapy) and T1 (last PMT visit). PD, CAL, and BOP were evaluated at six sites per tooth (mesio-, mid- and disto-buccal; mesio-, mid- and disto-lingual). Radiographic bone loss was calculated from either periapical or bitewing radiographs.

### 2.4 | Statistical analysis

The following variables were analyzed: age, sex, tooth identifier, position (anterior/posterior), jaw (maxilla/mandible), time from T0 to T1, tooth status at T1 (periodontal-related loss, loss for a non-periodontal cause, present), number of PMT visits from baseline to the last follow-up, and tooth-level membership class.

Survival analyses were performed after checking for the presence of proportional hazard assumption (estat phtest in STATA), for TLP using both univariate and multivariate Cox regression frailty models that were built for each classifier. In the multivariate model, the tooth classifier memberships were included with potential confounding factors (age, sex, and number of maintenance visits underwent by the tooth during the whole follow-up). To analyze the prognostic performance, the modified PRS, overall performance (Harrell C-index and Royston index) and model fit (Akaike and Bayesian information criterion) were measured for each Cox regression model.<sup>15</sup> In addition, a post-hoc comparison was conducted using the Bonferroni test to evaluate intra-class stratification in both systems. Ratios of restricted mean survival time (RMST) in the univariate analysis for the comparison with the reference class were also assessed.

**TABLE 1** Patient characteristics and patient-related parameters of the included sample

Characteristics	Enrolled
<b>Sex</b>	
Teeth in females, <i>n</i> (%)	3478 (51.43%)
Teeth in males, <i>n</i> (%)	3284 (48.57%)
<b>Age, years</b>	47.58 ± 12.01
<b>Follow-up, months</b>	270.9 ± 76.08
<b>Total teeth T0, <i>n</i></b>	6762
Mandibular teeth T0, <i>n</i> (%)	3371 (49.85%)
Maxillary teeth T0, <i>n</i> (%)	3391 (50.15%)
Posterior teeth T0, <i>n</i> (%)	3784 (55.96%)
Anterior teeth T0, <i>n</i> (%)	2978 (44.04%)
<b>Status at the end of follow-up</b>	
Survived, <i>n</i> (%)	6062 (89.65%)
Lost for periodontal disease, <i>n</i> (%)	303 (5.87%)
Lost for other reasons, <i>n</i> (%)	397 (5.87%)

Abbreviation: T0, time of active periodontal therapy.

## 3 | RESULTS

### 3.1 | Baseline sample characteristics and descriptive statistics

A total of 281 patients (132 females and 149 males; mean age, 47.58 ± 12.01 years) accounting for 6762 teeth were included in the analysis. Excluded patients had missing information (mostly systemic conditions) at baseline that precluded usage of the PRS. At baseline, 3391 maxillary and 3371 mandibular teeth were present. Of these, 3784 teeth were located posteriorly (molar and premolar regions), and 2978 were located anteriorly. Characteristics of the patient cohort are reported in more detail in Table 1.

The follow-up ranged from 10 to 47.6 years, with the mean follow-up of teeth included in the analysis being 270.9 ± 76.08 months (22.6 ± 6.34).

### 3.2 | General prognostic performance of the original and simplified index

The two most frequent categories based on the MMPPI index were score 1 (40.96%) and 2 (15.13%), respectively, and the least were score 10 (0.15%) and 9 (0.38%), respectively. Similarly, for the PRS, the most frequent category was score 1 (69.23%), followed by scores 2 (25.72%) and 3 (5.06%), in an ascending order. The original Miller–McEntire model comprising 11 classes of risk yielded a prognostic performance of Harrell C-index equal to 0.7410 at the multilevel univariate Cox regression frailty model. On the other hand,

**TABLE 2** A logistic regression model performed for periodontal-related tooth loss over 5-year follow-up period

Prognosis		OR, 95% CI	<i>p</i> value	Coeff, 95% CI	<i>p</i> value
1 (Ref)	Excellent	1.00	–	1.00	–
2	Good	5.75 (2.59–12.74)	0.000	1.74 (0.95–2.54)	0.000
3	Guarded	20.68 (8.77–48.73)	0.000	3.02 (2.17–3.88)	0.000

the PRS including 3 risk classes yielded a prognostic performance of 0.7157. The prognostic performance of both predictive models still resulted in a significant result at the multivariate analysis when included in a Cox model with other covariates (namely, age, sex, and maintenance visits). This yielded a prognostic performance of Harrell C-index equal to 0.9469 for the PRS.

Regarding differentiation in prognostic capability between molar and molar teeth, the PRS showed a slightly better prognostic performance for non-molar (C-index = 0.6869) compared with molar teeth (0.6662) in the multilevel univariate analysis.

### 3.3 | Stratified prognostic performance of the original and modified index

For the 5-year follow-up, using a logistic regression model, teeth lost for other reasons before the 5-year threshold have been excluded. An odds ratio of  $5.75 \pm 2.33$  (95% confidence interval [CI], 2.59–12.74) for Class 2 and  $20.68 \pm 9.04$  (95% CI, 8.77–48.73) for Class 3 for tooth loss compared with Class 1 (Table 2). The AUC (area under the curve) of the receiver-operating characteristics showed a moderate accuracy of 0.76. AUC was calculated at the univariate analysis.

The PRS stratified teeth accurately into each of its three categories ( $p < 0.05$ ), while the MMPPI index did not (see Supplementary Figure S1 in online *Journal of Periodontology*). The univariate analysis showed a hazard ratio (HR) of  $3.48 \pm 0.47$  (95% CI, 2.67–4.53) for Class 2 and  $13.09 \pm 2.00$  (95% CI, 9.70–17.68) for Class 3 in the PRS (Table 3). These remained statistically significant in the multivariate analysis with HRs of  $3.66 \pm 0.67$  (95% CI, 2.55–5.25) and  $10.93 \pm 2.59$  (95% CI, 6.87–17.40), respectively. Incisors and premolars had significantly less HR to be lost due to periodontitis compared with molar teeth (HR, 3.3 versus 10;  $P = 0.000$ ). Supplementary Table S1 in the online *Journal of Periodontology* shows risk stratification by tooth type.

The survival curves based on the multilevel multivariate Cox regression analysis are depicted in Supplementary Figure S2 in the online *Journal of Periodontology*, which shows survival curves comparing MMPPI to the PRS; and molar versus non-molar and maxillary versus mandibular teeth, respectively.

### 3.4 | Probability of tooth loss

The PRS showed moderate sensitivity (78.05%) and specificity (69.60%). Sensitivity and specificity have been calculated using univariate analysis. A total of 700 teeth (10.35%) were lost throughout the follow-up period; of these, 303(4.48%) were TLP. Survival analysis of PRS in 5-year increments up to 30 years follow-up is shown in Supplementary Table S2 (see online *Journal of Periodontology*).

## 4 | DISCUSSION

The present observational study validated a modified version of the Miller–McEntire prognosis system that was designed for only posterior teeth and lacked significance between categories when evaluating the prognostic performance.<sup>6</sup> Excellent prognostic performance was demonstrated by both the modified indices (c-index of 0.947), with prognostic assessment of non-molar teeth being superior to that of molar teeth by the modified index.

External validation using a different patient cohort is a key component in demonstrating the applicability of any diagnostic or prognostic prediction model.<sup>16</sup> A recent investigation by our group compared through external validation the prognostic performance of 10 different prognostic systems.<sup>6</sup> In that study, the original Miller–McEntire demonstrated the best model fit after a univariate and multivariate analysis as it relates to prognostic performance with TLP as an end point. The external validation of this proposed, modified model uses a new and distinct patient cohort compared with the previous investigation. Due to overall tooth loss not being an accurate end point of specifically periodontal risk assessment<sup>17–19</sup> and significantly impairing all prognostic systems in our previous investigations,<sup>6,20</sup> TLP was the single end point used in the analyses of this study.

Some of the previous concerns using the MMPPI were: (A) It was originally developed and validated for use only for posterior teeth.<sup>7</sup> (B) When the original index was externally validated, it was noted that not all class severities showed statistically significant interclass differences. This was attributed to the index having 11 classes, which made the number of teeth assigned to each class less considerable.<sup>6</sup> (C) Another problem with such a big number of classes is that it makes its use clinically less practical



**TABLE 3** Univariate and multivariate risk stratification performed for periodontal-related tooth loss using multilevel Cox regression frailty models performed for the overall follow-up time

Factors	Multilevel univariate HR (95% CI), <i>p</i> value	Multilevel multivariate HR (95% CI), <i>p</i> value
<b>Age</b>	1.01 (0.99–1.03), 0.297	
<b>Maintenance</b>	0.82 (0.81–0.84), (0.001)	0.83 (0.81–0.85), (0.001)
<b>Sex</b>		
Male	Ref.	
Female	0.936 (0.58–1.50), (0.783)	
<b>Position</b>		
Anterior	Ref.	Ref.
Posterior	2.51 (1.94–3.26), (0.001)	1.14 (0.76–1.71), 0.531
<b>Jaw</b>		
Mandibular	Ref.	Ref.
Maxillary	1.57 (1.24–1.98), (0.001)	0.79 (0.55–1.14) 0.207
<b>Modified score</b>		
Excellent	Ref.	Ref.
Good	4.16 (3.06–5.69), (0.001)	3.65 (2.02–5.18), (0.001)
Guarded	17.54 (11.7–29.3), (0.001)	10.9 (3.85–15.9), (0.001)
<b>Tooth type</b>		
Incisor	Ref.	Ref.
Canine	0.30 (0.16–0.55), (0.001)	0.42 (0.19–0.93), (0.032)
Premolar	0.99 (0.70–1.39), (0.955)	0.94 (0.65–1.47), (0.967)
Molar	2.99 (2.23–4.01), (0.001)	2.82 (1.66–4.78), (0.001)

and difficult to explain to the patient. (D) Finally, few modifications were made to the MMPPI, like adding stipulations for the number of cigarettes smoked<sup>21</sup> and the level of diabetic control.

One aspect of prognostic performance that makes a prognostic system ideal is clear inter-category distinction.<sup>22</sup> As mentioned previously, the MMPPI was among prognostic systems that showed a lack of significance between disease severity.<sup>6</sup> This was demonstrated once again in the current multilevel, multivariate analysis of the present investigation. In contrast, with only 3 classes, the PRS demonstrated significant differences between disease categories with an HR of 3.7 and 10.9 for class 2 and 3, respectively. This means that merging classes of severity with the goal of reducing the number of categories provides pragmatism to the overall index and lays out distinct groups that can be confidently expected to clinically behave differently over time. It is noteworthy that the standard errors and 95% CIs of the MMPPI categories of severity are quite wide, and particularly in relation to those of the PRS. This is most likely a function of decreased number of statistical units per category, especially that this effect increases with ascending categories (e.g.,  $n = 79$  for score 7,  $n = 32$  for score 8,  $n = 26$  for score 9,  $n = 10$  for score 10). This also indirectly contributes to the resultant ambiguous stratification between categories, which is counteracted by the PRS providing clearer inter-category distinction.

The PRS exhibited better prognostic performance for single-rooted versus multirooted teeth. Molar teeth have been historically documented to be more commonly lost as a result of periodontal disease.<sup>19,23–25</sup> This is primarily attributed to the presence of furcation involvement which, in its moderately to severely advanced form, is an evidenced risk factor for tooth loss.<sup>24,26</sup> In the PRS, single-rooted teeth are automatically assigned a score of 0 for two of the seven categories. This allows for single-rooted teeth to only acquire a greater score when other factors (e.g., smoking, diabetes, PD) are in more advanced stages, which is clinically when single-rooted teeth are most observed to be lost to periodontal disease.

The present investigation is characterized by some key merits. Firstly, the MMPPI is based on a tooth survival model which showed a 38% increase in the risk of tooth loss with each unit increase in the index<sup>7</sup> and it was confirmed as possibly the best predictive prognostic tool present.<sup>9</sup> Its strength comes from the weight of systemic factors in the overall prognostic assessment compared with other prognostic tools<sup>6</sup>; factors which are well-evidenced in influencing periodontal disease and specifically TLF.<sup>9,22,27</sup> This lays the fundamental clinical value of the succeeding, modified index. Secondly, while the MMPPI was developed to exclusively evaluate the prognosis of multirooted teeth, the modified index has demonstrated increased applicability in its successful use for single-rooted teeth as well. Thirdly, the data in this study are based on a large sample

size that is associated with a nearly 23-year observational period. Prognostic tools are devised to provide an effective prediction method for both clinicians and patients, and oftentimes patients are concerned with the expected timeline of their oral health and therapeutic outcomes.

This model showed a moderate sensitivity (78.05%) and specificity (69.60%). A very low sensitivity has been the hallmark of tooth loss predictive models reported previously (ranging between 0% and 21%).<sup>5,28</sup> That said, the presented model also appears to have less specificity than other models that reach almost 100%. We presume that the higher sensitivity attained in this study is due to considering periodontal tooth loss rather than overall tooth loss as an outcome<sup>17</sup>; and that the lower specificity is due to the very long follow-up period of patient follow-up, meaning our exposures may have significantly changed over time (for instance smoking, systemic conditions, etc.), which also means a wider window for periodontal breakdown.

A long-term follow-up such as that demonstrated in this investigation provides greater confidence in the predictability of the index's quantitative prognostic assessment. Nonetheless, it may also be limitations to this study. The understanding of available evidence, clinical practice, and decision-making regarding extraction versus implant placement changes over years. Moreover, since we excluded any data from patients who were non-maintenance-compliant, and those who had a follow-up of  $\leq 10$  years, we may have inadvertently fell into selection bias. Finally, we used complete case analyses to fulfill each category of the PRS prognostic system, which led to exclusion of more patients.

A predictive model that is built on retrospective data like the one presented in this study should be validated prospectively. However, using periodontal tooth loss as an outcome in such cases might be challenging. Periodontitis progression can be defined in different ways, where tooth loss due to periodontitis (as compared with overall tooth loss) seems to be the most definitive. Such incident (periodontal tooth loss) happens over long years in maintained populations;<sup>11</sup> the authors of the longitudinal studies acknowledged that early on and chose CAL as a surrogate of periodontitis progression instead of periodontal tooth loss.

In the future, it will be ideal for this model to be validated prospectively by a different group of investigators as a continuation to the validation of our model development studies.

## 5 | CONCLUSIONS

The PRS has demonstrated better prognostic performance to the original MMPPI. Better prognostic performance was

found for non-molar compared to molar teeth. The PRS more effectively and accurately stratified teeth into categories of severity, while being more pragmatic due to the reduced number of overall categories.

## AUTHOR CONTRIBUTIONS

Study conception and design were performed by Muhammad Saleh and Giuseppe Troiano. Analysis and interpretation of the data were performed by Muhammad Saleh, Himabindu Dukka, Giuseppe Troiano, and Mustafa Tattan. Data collection was performed by Muhammad Saleh, Andrea Ravidà, and Himabindu Dukka. Drafting the manuscript was done by Mustafa Tattan, Muhammad Saleh, and Robert Levine. Leadership and critical review were performed by Preston D. Miller and Hom-Lay Wang. All authors gave their final approval and agreed to be accountable for all aspects of the work.

## CONFLICT OF INTEREST

The authors do not have any financial interests, either directly or indirectly, in the products or information listed in the paper.

## DATA AVAILABILITY STATEMENT

The data that support the findings of this study are available from the corresponding author upon request.

## ORCID

Muhammad H. A. Saleh <https://orcid.org/0000-0001-5067-7317>

Mustafa Tattan <https://orcid.org/0000-0001-7498-8064>

Giuseppe Troiano <https://orcid.org/0000-0001-5647-4414>

Andrea Ravidà <https://orcid.org/0000-0002-3029-8130>

Hom-Lay Wang <https://orcid.org/0000-0003-4238-1799>

## REFERENCES

1. Tan H, Peres KG, Peres MA. Retention of teeth and oral health-related quality of life. *J Dent Res*. 2016;95:1350-1357.
2. Kye W, Davidson R, Martin J, Engebretson S. Current status of periodontal risk assessment. *J Evid Based Dent Pract*. 2012;12:2-11.
3. Saleh MHA, Dukka H, Troiano G, et al. Long term comparison of the prognostic performance of PerioRisk, periodontal risk assessment, periodontal risk calculator, and staging and grading systems. *J Periodontol*. 2022;93:57-68.
4. Nunn ME, Fan J, Su X, Levine RA, Lee HJ, McGuire MK. Development of prognostic indicators using classification and regression trees for survival. *Periodontol 2000*. 2012;58:134-142.
5. Saydzai S, Buontempo Z, Patel P, et al. Comparison of the efficacy of periodontal prognostic systems in predicting tooth loss. *J Clin Periodontol*. 2022;49:740-748.
6. Saleh MHA, Dukka H, Troiano G, et al. External validation and comparison of the predictive performance of 10 different tooth-level prognostic systems. *J Clin Periodontol*. 2021;48:1421-1429.



7. Miller PD Jr, McEntire ML, Marlow NM, Gellin RG. An evidenced-based scoring index to determine the periodontal prognosis on molars. *J Periodontol.* 2014;85: 214-225.
8. Levine RA, Miller PD. The Miller McEntire Periodontal Prognostic Index (i.e., “The Perio Report Card”) Usage in Practice. In: Nares S, ed. *Advances in Periodontal Surgery: A Clinical Guide to Techniques and Interdisciplinary Approaches.* Springer; 2020: 3-21.
9. Ravida A, Troiano G, Qazi M, et al. Dose-dependent effect of smoking and smoking cessation on periodontitis-related tooth loss during 10–47 years periodontal maintenance – a retrospective study in compliant cohort. *J Clin Periodontol.* 2020;47:1132-1143.
10. Collins GS, Reitsma JB, Altman DG, Moons KG. Transparent reporting of a multivariable prediction model for Individual Prognosis or Diagnosis (TRIPOD): the TRIPOD statement. *J Clin Epidemiol.* 2015;68:134-143.
11. Needleman I, Garcia R, Gkraniats N, et al. Mean annual attachment, bone level, and tooth loss: a systematic review. *J Periodontol.* 2018;89:S120-S139. Suppl 1.
12. Farooqi OA, Wehler CJ, Gibson G, Jurasic MM, Jones JA. Appropriate recall interval for periodontal maintenance: a systematic review. *J Evid Based Dent Pract.* 2015;15:171-181.
13. Rentfro AR, McEwen M, Ritter L. Perspectives for practice: translating estimated average glucose (eAG) to promote diabetes self-management capacity. *Diabetes Educ.* 2009;35:585-586. 581. 588-590 passim.
14. Rohlfing CLWH, Little RR, England JD, Tennill A, Goldstein DE. Defining the relationship between plasma glucose and [HbA1c]: analysis of glucose profiles and [HbA1c] in the diabetes control and complications trial. *Diabetes Care.* 2002;25:275-279.
15. Rahman MS, Ambler G, Choodari-Oskoei B, Omar RZ. Review and evaluation of performance measures for survival prediction models in external validation settings. *BMC Med Res Methodol.* 2017;17: 60.
16. Steyerberg EW. Prediction models need appropriate internal, internal-external, and external validation. *J Clin Epidemiol.* 2016;69:245-247.
17. Ravida A, Qazi M, Troiano G, et al. Using periodontal staging and grading system as a prognostic factor for future tooth loss: a long-term retrospective study. *J Periodontol.* 2020;91:454-461.
18. Al-Shammari KF, Al-Khabbaz AK, Al-Ansari JM, Neiva R, Wang HL. Risk indicators for tooth loss due to periodontal disease. *J Periodontol.* 2005;76:1910-1918.
19. Chambrone L, Chambrone D, Lima LA, Chambrone LA. Predictors of tooth loss during long-term periodontal maintenance: a systematic review of observational studies. *J Clin Periodontol.* 2010;37:675-684.
20. Ravida A, Troiano G, Qazi M, et al. Development of a nomogram for the prediction of periodontal tooth loss using the staging and grading system: a long-term cohort study. *J Clin Periodontol.* 2020;47:1362-1370.
21. Gopalakrishnan D, Miller PD, Mahuli AV, Sangamithra S, Phantumvanit P, Buranawat B. Prospective evaluation of periodontally diseased molars in smokers using the Miller-McEntire Periodontal Prognostic Index. *J Indian Soc Periodontol.* 2018;22:304-309.
22. Kwok V, Caton JG. Commentary: prognosis revisited: a system for assigning periodontal prognosis. *J Periodontol.* 2007;78:2063-2071.
23. Wood WR, Greco GW. Tooth loss in patients with moderate periodontitis after treatment and long-term maintenance care. *J Periodontol.* 1989;60:516-520.
24. Petsos H, Ramich T, Nickles K, et al. Tooth loss in periodontally compromised patients: retrospective long-term results 10 years after active periodontal therapy – tooth-related outcomes. *J Periodontol.* 2021;92:1761-1775.
25. Checchi L, Montecocchi M, Gatto MR, Trombelli L. Retrospective study of tooth loss in 92 treated periodontal patients. *J Clin Periodontol.* 2002;29:651-656.
26. Huynh-Ba G, Kuonen P, Hofer D, Schmid J, Lang NP, Salvi GE. The effect of periodontal therapy on the survival rate and incidence of complications of multirrooted teeth with furcation involvement after an observation period of at least 5 years: a systematic review. *J Clin Periodontol.* 2009;36:164-176.
27. Ravida A, Galli M, Saleh MHA, et al. Maintenance visit regularity has a different impact on periodontitis-related tooth loss depending on patient staging and grading. *J Clin Periodontol.* 2021;48:1008-1018.
28. Krois J, Graetz C, Holtfreter B, Brinkmann P, Kocher T, Schwendicke F. Evaluating modeling and validation strategies for tooth loss. *J Dent Res.* 2019;98:1088-1095.

## SUPPORTING INFORMATION

Additional supporting information can be found online in the Supporting Information section at the end of this article.

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