

1 Article

2 Diagnostic Models for Screening of Chronic 3 Periodontitis with Cytokines and Microbiologic 4 Profiles in Saliva

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21 **Abstract:** This study was to investigate and assess salivary biomarkers as a means of diagnosing
22 periodontitis. A total of 121 subjects were included: 28 periodontally healthy subjects, 24 with stage
23 I, 24 with stage II, 23 with stage III, and 22 with stage IV periodontitis. Salivary proteins including
24 active matrix metalloproteinase-8 (MMP-8), pro-MMP-8, total MMP-8, C-reactive protein, secretory
25 immunoglobulin A and planktonic bacteria including *Aggregatibacter actinomycetemcomitans*,
26 *Porphyromonas gingivalis*, *Tannerella forsythia*, *Treponema denticola*, *Fusobacterium nucleatum*,
27 *Prevotella intermedia*, *Porphyromonas nigrescens*, *Parvimonas micra*, *Campylobacter rectus*,
28 *Eubacterium nodatum*, *Eikenella corrodens*, *Streptococcus mitis*, *Streptococcus mutans*,
29 *Staphylococcus aureus*, *Enterococcus faecalis*, and *Actinomyces viscosus* were measured from
30 salivary samples. The performance of the diagnostic models was assessed by receiver operating
31 characteristics (ROC) and area under the ROC curve (AUC) analysis. The diagnostic models were
32 constructed based on the subjects' proteins and/or microbial profiles, resulting in two potential
33 diagnosis models, which achieved better diagnostic powers with an AUC value > 0.750 for the
34 diagnosis of stage II, III, and IV periodontitis (Model PC-I; AUC: 0.796, sensitivity: 0.754, specificity:
35 0.712) and for the diagnosis of stage III and IV periodontitis (Model PC-II; AUC: 0.796, sensitivity:
36 0.756, specificity: 0.868). This study can contribute to screening for periodontitis based on salivary
37 biomarkers.

38 **Keywords:** periodontitis; diagnosis; saliva; biomarkers; matrix metalloproteinase; cytokines.
39

40 1. Introduction

41 The diagnosis of periodontitis is conventionally based on clinical evaluation, radiographic
42 examinations, and periodontal parameters, including probing pocket depth, bleeding on probing,
43 clinical attachment level, periodontal index and gingival index. However, conventional methods
44 reflect the past evidence of inflammatory and infectious progression and the current extent and

45 severity of the chronic pathology. However, they do not address current activity or its episodic
46 progression [1]. To overcome the aforementioned limitations, various tools for the detection of
47 periodontitis have been developed and introduced [2,3].

48 The use of oral saliva as oral-based diagnostics has proven to be easy to use for point of care
49 (POC) application. Oral-based diagnostics have been developed to detect several pathologies
50 including oral cancer, human immunodeficiency virus infection, hepatitis C infection, and Ebola
51 virus infection, with the advantages of being readily accessible and minimally invasive [4-7]. The ease
52 of access and sampling of saliva containing inflammatory cytokines, microbial or viral infection
53 provides potential possibilities for its use in the diagnosis of periodontitis [8].

54 It has been observed that there is an equilibrium in the interaction between the host and
55 microorganisms when the periodontal apparatus is healthy [9]. This ecosystem can be affected by
56 genetic factors of the host and environmental factors including smoking or diet [10]. The
57 development of periodontal pathology is the outcome of several changes in the host or environmental
58 state, indicating a possible relationship between the risk of periodontitis and susceptibility factors
59 [11].

60 A previous study has demonstrated that microbiological variables could show a discriminating
61 potential in distinguishing subjects with periodontitis [12]. Periodontal pathogens can induce the
62 immune reaction of the host, resulting in the release of cytokines including matrix metalloproteinase-
63 8 (MMP-8), C-reactive protein (CRP), secretory IgA (sIgA) [13-15]. A variety of these microbial
64 profiles and inflammatory cytokines in saliva have been investigated as diagnostic tools for the
65 detection of periodontitis. Although this diagnostic method has shown potential for identifying
66 periodontitis, some limitations have been reported for this diagnostic tool that uses a single
67 biomarker [8]. There was a study that showed an improvement of sensitivity and specificity in
68 detection using a model that combined related biomarkers [16]. As periodontitis is a multifactorial
69 disease, a model combining microbial profiles and cytokines involved in chronic infection might
70 improve its diagnostic accuracy.

71 Recently, for the purpose of reflecting the severity, extent, and complexity of periodontal
72 breakdown, a new classification of periodontitis has been suggested [17]: stage I, initial periodontitis;
73 stage II, moderate periodontitis; stage III, severe periodontitis with potential for additional tooth loss;
74 stage IV, advanced periodontitis with extensive tooth loss and potential for loss of dentition.
75 However, little evidence has been accumulated in support of using salivary biomarkers for such a
76 classification system.

77 The aim of this study was to verify alterations in salivary biomarkers, including microbial
78 profiles and cytokines according to periodontal status, and to investigate a combined model for
79 periodontitis in accordance with the new classification.

80 2. Materials and Methods

81 2.1. Subjects

82 This clinical study was approved by the Institutional Review Board of Seoul National University
83 Dental Hospital. The subjects in this study were recruited from July 2019 to December 2019. Upon
84 receiving written consent, 121 human subjects aged 18 years or older were evaluated at the
85 Department of Periodontology in the Seoul National University Dental Hospital. All subjects
86 involved in this study were required to have 20 or more teeth. In addition, the exclusion criteria
87 applied was as follows: (a) use of any antibiotics or anti-inflammatory drugs within 3 months of
88 registration; (b) use of an immunosuppressant (methotrexate, leflunomide, tacrolimus, cyclosporin,
89 azathioprine) or adrenal cortical hormone (oral or injection) within 3 months of registration; (c)
90 having less than 20 teeth; (d) having uncontrolled hypertension or diabetes; (e) subjects who have
91 serious cardiovascular disease, respiratory system disease, kidney disease, liver disease, digestive
92 system disease, blood system disease and neuropsychiatric disease; (f) subjects with hyperthyroidism
93 or hypothyroidism; (g) women who were pregnant or planning to become pregnant; (h) subjects with
94 autoimmune diseases; (i) subjects with a history or presence of malignant tumors in the jawbone; (j)

95 subjects who have had a history of or are currently using drugs or alcohol abuse within one year; (k)
96 subjects with other inflammatory diseases in the oral cavity besides periodontitis, such as stomatitis
97 (including ulcerative, blistering, erosive), oral cancer; (l) subjects with other inflammatory diseases
98 in the oral cavity besides periodontitis, such as ulcers, simple herpes and shingles, fungal or bacterial
99 infections; and (m) subjects whose participation was judged by the researcher to be inappropriate
100 because their involvement may cause ethical problems or seriously affect the research results.

101

102 2.2. Clinical and radiographic examination

103 A consent form was signed by and obtained from each subject following the sufficient
104 explanation of the study. To identify if the subject was suitable for this study, demographic
105 information such as gender and date of birth was obtained, and the systemic conditions of the
106 participants were also examined.

107 On the first visit, clinical examinations were performed, and the following parameters were
108 recorded. The gingival index (GI) [18] and plaque index (PI) [19] were examined on the buccal and
109 lingual surfaces of the teeth. Additionally, the probing pocket depth (PPD), gingival recession (GR)
110 and clinical attachment level (CAL) were measured at the six sites around the tooth. The amount of
111 tooth loss (TL), sites of bleeding on probing (BOP), tooth mobility (TM) and furcation involvement
112 (FI) were recorded per tooth. Alveolar bone loss at the mesial and distal site of the tooth was
113 measured with periapical radiographs. The subjects were classified into healthy, and stages I, II, III
114 , and IV depending on the severity, extent, and complexity of their periodontitis [17].

115

116 2.3. Preparation of solution for saliva storage

117 Approximately 0.1 M phenylmethylsulphonyl fluoride (PMSF) stock solution dissolved in
118 isopropanol was stored at room temperature, and 0.5 M ethylenediaminetetraacetic acid (EDTA)
119 stock solution dissolved in distilled water (DW) was stored refrigerated. The two stock solutions were
120 stored independently, due to the instability of PMSF when mixed with 1X phosphate-buffered saline
121 (PBS).

122

123 2.4. Whole saliva with draining method

124 Unstimulated saliva was collected with the participant's head tilting slightly forward in a sitting
125 position by drooling into a funnel-shaped test tube. The sampling was performed for 15 minutes and
126 was stopped when the amount collected reached 5 ml. Subsequently, the saliva sample was placed
127 on ice, and supplemented with 1X PBS 4930 μ l, 20 μ l EDTA solution, and 50 μ l PMSF stock solution;
128 then, vortexing was performed. The samples were stored in a deep freezer at a temperature of -80 °C
129 immediately after collection for the preservation of biomarkers.

130

131 2.5. Saliva collection for oral microbial identification

132 After collecting GCF, subjects took another break for 5 minutes. The subjects gargled and rinsed
133 with gargle solution (EasyperiO kit, YD Life Science Company, Gyeonggi-do, Korea) for 30 seconds,
134 and then spit it into the sample container. The sample container cap was closed tightly. Samples were
135 stored in a refrigerator (4 °C) and transported to the analytical company (YD Life Science company,
136 Gyeonggi-do, Korea) under dry ice.

137

138 2.6. Protein Biomarker Assays

139 Protein biomarker levels were detected with colorimetric-based enzyme-linked immunosorbent
140 assays (ELISAs) for measurement of active MMP-8, pro-MMP-8, total MMP-8, CRP, and sIgA
141 according to the manufacturer's protocols (Sugentech, Osong, Korea). Prior to performing the assay,
142 1 ml of whole saliva was passed through a 0.45- μ m syringe filter to obtain cell-free supernatant. After
143 diluting the sample at a predetermined ratio, 75 μ l of the diluted solution was dispensed into the
144 sample inlet using a micropipette. After 10 minutes, absorbance measurements were collected using
145 a fluorescence measurement device (Sugentech, Osong, Korea).

146

147 2.7. Detection of microbiologic profiles

148 The samples were analyzed by quantitative analysis using multiplex-quantity real time
 149 polymerase chain reaction (PCR) according to the manufacture's protocol (EasyPerio; YD life science,
 150 Gyeonggi-do, Korea) for 16 oral pathogenic bacteria: *Aggregatibacter actinomycetemcomitans* (A.
 151 *actinomycetemcomitans*, Aa), *Porphyromonas gingivalis* (P. *gingivalis*, Pg), *Tannerella forsythia* (T.
 152 *forsythia*, Tf), *Treponema denticola* (T. *denticola*, Td), *Fusobacterium nucleatum* (F. *nucleatum*, Fn),
 153 *Prevotella intermedia* (P. *intermedia*, Pi), *Porphyromonas nigrescens* (P. *nigrescens*, Pn), *Parvimonas*
 154 *micra* (P. *micra*, Pm), *Campylobacter rectus* (C. *rectus*, Cr), *Eubacterium nodatum* (E. *nodatum*, En),
 155 *Eikenella corrodens* (E. *corrodens*, Ec), *Streptococcus mitis* (S. *mitis*, Sm), *Streptococcus mutans* (S.
 156 *mutans*, Smu), *Staphylococcus aureus* (S. *aureus*, Sa), *Enterococcus faecalis* (E. *Faecalis*, Ef), and
 157 *Actinomyces viscosus* (A. *viscosus*, Av). Patient-based microbiologic data was analyzed.

158

159 2.8. Statistical Analysis

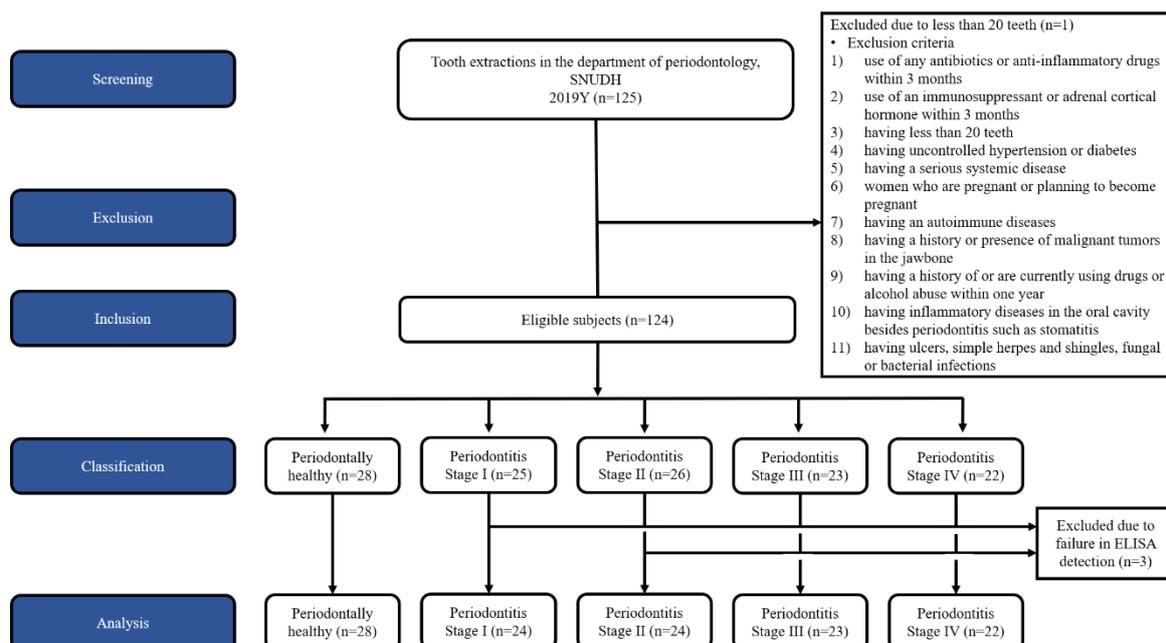
160 Continuous data was represented with means and standard deviation for each subject group.
 161 Group comparisons were made using one-way ANOVA in SPSS version 17 (IBM Software, Armonk,
 162 New York, USA). Dichotomized data was represented with number and percentage for each subject
 163 group. Group comparisons were made with a Fisher's exact test. Differences were considered
 164 statistically significant when the P-value < 0.05. Seven diagnostic models of periodontitis (Model PD),
 165 stage I periodontitis (Model PD-I), stage II periodontitis (Model PD-II), stage III periodontitis (Model
 166 PD-III), stage IV periodontitis (Model PD-IV), periodontitis above stage I (stage II, III, and IV; Model
 167 PA-I), and periodontitis above stage II (stage III and IV; Model PA-II) were constructed according to
 168 the concentration of proteins and microbial profiles based on a forward stepwise logistic regression
 169 analysis using SPSS statistics 21.0 software. The diagnostic models were evaluated by sensitivity,
 170 specificity, and ROC curve analysis using Excel (Microsoft 365, Redmond, Washington, USA).

171

172 3. Results

173 3.1. Demographic and clinical characteristics of subjects

174



175

Figure 1. CONSORT flow diagram of the study.

176

177 Thirty-eight male (30.4%) and eighty-seven female (69.6%) subjects, ranging in age from 20 to 79
 178 years, were enrolled in the study. Following the recording of clinical and radiographic parameters,
 179 the subjects were allocated into the five groups of periodontal status. One subject was excluded due
 180 to lack of teeth. The data of three subjects were excluded because the proteins including active MMP-
 181 8, pro-MMP-8, total MMP-8 did not show detectable levels in the whole saliva sample. A total of 121
 182 subjects were included in the final analysis (Figure 1). The analysis of the data obtained from the
 183 healthy (n = 28), and periodontitis population (n = 93; stage I: 24 stage II: 24 stage III: 23 and stage IV:
 184 22) were performed in this study.

185

186

187

Table 1. Demographic characteristics, clinical periodontal parameters, salivary biomarkers and planktonic bacteria of each group (mean \pm standard deviation).

	Healthy Controls (HC) (n=28)	Periodontitis (PD)				Significance
		PS-I (n=24)	PS-II (n=24)	PS-III (n=23)	PS-IV (n=22)	
Age	30.04 \pm 8.79	35.00 \pm 15.10	49.21 \pm 16.92	58.17 \pm 14.40	61.41 \pm 11.35	< 0.001
Sex						
Male	4 (14.3%)	3 (12.5%)	11 (45.8%)	9 (39.1%)	10 (45.5%)	0.010
Female	24 (85.7%)	21 (87.5%)	13 (54.2%)	14 (60.9%)	12 (54.5%)	
Hypertension	0	1 (4.2%)	1 (4.2%)	4 (17.4%)	6 (27.3%)	0.005
Diabetes	0 (0.0%)	1 (4.2%)	0 (0.0%)	2 (8.7%)	4 (18.2%)	0.023
Osteoporosis	0 (0.0%)	1 (4.2%)	0 (0.0%)	0 (0.0%)	0 (0.0%)	0.769
Hepatitis	0 (0.0%)	0 (0.0%)	1 (4.2%)	0 (0.0%)	0 (0.0%)	0.769
Smoking	0 (0.0%)	0 (0.0%)	2 (8.3%)	4 (17.4%)	1 (4.5%)	0.032
# of teeth	27.68 \pm 1.467	27.44 \pm 1.227	27.46 \pm 1.560	27.56 \pm 1.635	26.59 \pm 1.681	0.12
BOP, %	30 \pm 18	37 \pm 19	28 \pm 20	35 \pm 23	32 \pm 24	0.595
Mean GI	0.58 \pm 0.57	0.66 \pm 0.45	0.50 \pm 0.39	0.66 \pm 0.69	0.75 \pm 0.55	0.592
Mean PI	0.48 \pm 0.41	0.51 \pm 0.45	0.42 \pm 0.45	0.73 \pm 0.58	0.61 \pm 0.51	0.184
Mean PPD	2.36 \pm 0.26	2.54 \pm 0.30	2.54 \pm 0.33	2.70 \pm 0.56	2.83 \pm 0.62	0.003
Mean GR	0.11 \pm 0.33	0.053 \pm 0.056	0.12 \pm 0.15	0.26 \pm 0.27	0.65 \pm 0.97	< 0.001
Mean CAL	0.24 \pm 0.58	0.12 \pm 0.12	0.27 \pm 0.29	0.57 \pm 0.59	1.25 \pm 1.43	< 0.001
Mean ABL	0.077 \pm 0.32	0.22 \pm 0.16	0.50 \pm 0.27	1.18 \pm 0.71	2.34 \pm 2.07	< 0.001
# of FI	0	0	0	0.36 \pm 0.78	0.73 \pm 1.32	< 0.001
TM0	27.25 \pm 2.45	27.20 \pm 1.35	27.29 \pm 1.33	26.36 \pm 1.98	24.09 \pm 3.31	< 0.001
TM1	0	0	0	0.80 \pm 1.38	1.64 \pm 2.08	< 0.001
TM2	0	0	0	0	0.27 \pm 0.63	0.001
TM3	0	0	0	0.04 \pm 0.20	0.23 \pm 0.61	0.022
Sal. Ez. (ng/mL)						
Active MMP-8	119.10 \pm 93.73	172.82 \pm 166.54	190.57 \pm 125.68	281.87 \pm 206.93	288.35 \pm 145.54	< 0.001
Pro-MMP -8	115.90 \pm 90.62	127.38 \pm 82.44	155.02 \pm 93.70	217.72 \pm 104.60	256.90 \pm 139.43	< 0.001
Total MMP-8	235.01 \pm 178.71	300.21 \pm 233.94	345.59 \pm 209.98	499.57 \pm 286.48	545.24 \pm 270.87	< 0.001
CRP	0.93 \pm 3.01	0.82 \pm 1.68	0.47 \pm 1.18	0.70 \pm 1.10	0.37 \pm 0.80	0.564
sIgA	225.16 \pm 135.68	221.45 \pm 133.02	221.25 \pm 115.93	321.20 \pm 163.72	336.21 \pm 184.33	0.012

188

189

190

Abbreviations: PS-I: stage-I periodontitis; PS-II: stage-II periodontitis; PS-III: stage-III periodontitis; PS-IV: stage-IV periodontitis; BOP: bleeding on probing; GI: gingival inflammation; PI: plaque index; PPD: probing pocket depth; GR: gingival recession; CAL: clinical attachment loss; ABL: alveolar bone loss; FI: furcation-

191 involved tooth; TM0: immobile tooth^o; TM1: mobile tooth with 1^o; TM2: mobile tooth with 2^o; TM3: mobile tooth
192 with 3^o; Sal. Ez.: salivary enzyme; MMP: matrix metalloproteinase; CRP: C-reactive protein; sIgA: secretory IgA.

193 The demographic data (Table 1) for systemic disease, including osteoporosis and hepatitis, were
194 balanced among the five groups. However, age, sex, hypertension, diabetes mellitus and smoking
195 were statistically and significantly different among the groups. The subjects with hypertension,
196 diabetes and smoking were not found in the periodontally healthy group; however, they were
197 significantly associated with stage III and IV periodontitis. In addition, the older participants were
198 significantly found the higher stage of periodontitis.

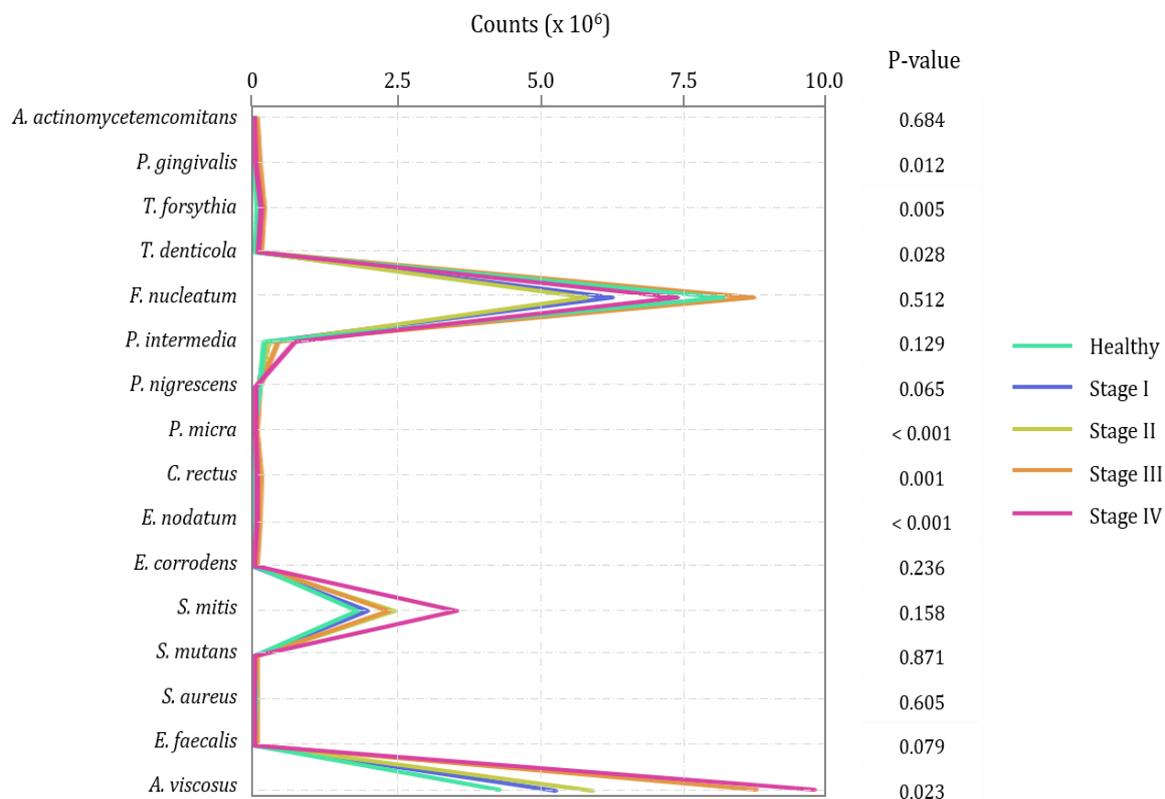
199 Dental and periodontal data (Table 1) were significantly different among the five groups for
200 mean GR (0.11 to 0.65; $P < 0.001$), mean PPD (2.36 to 2.83 mm; $P = 0.003$), mean CAL (0.24 to 1.25 mm;
201 $P < 0.001$), mean MBL (0.077 to 2.34 mm; $P < 0.001$), number of furcation-involved teeth (0 to 0.73;
202 $P < 0.001$), number of immobile teeth (24.09 to 27.25; $P < 0.001$), number of mobile teeth with grade 1
203 (0 to 1.64; $P < 0.001$), number of mobile teeth with grade 2 (0 to 0.27; $P = 0.001$), and number of mobile
204 teeth with grade 3 (0 to 0.23; $P = 0.022$).

205

206 3.2. Cytokines and microbial profiles in saliva

207 The data of proteins and microbiologic profiles are shown in Table 1. The levels of protein
208 concentrations of active MMP-8 ($P < 0.001$), pro-MMP-9 ($P < 0.001$), and total MMP-8 ($P < 0.001$) and
209 sIgA ($P = 0.012$) showed significant differences among the groups. The level of *P. gingivalis* ($P = 0.012$),
210 *T. forsythia* ($P = 0.005$), *T. denticola* ($P = 0.028$), *P. micra* ($P < 0.001$), *C. rectus* ($P = 0.001$), *E. nodatum*
211 ($P < 0.001$) and *A. viscosus* ($P = 0.023$) showed significant differences among the groups. The overall
212 microbial profiles are presented in Figure 2.

213



214 **Figure 2.** Changes in profiles of salivary bacteria according to stages of periodontitis ($\times 10^6$)

215

216 3.3. Construction of Diagnostic Models Based on Cytokines in Saliva

217 Diagnostic models of periodontitis (Model PD), stage I periodontitis (Model PD-I), stage II
218 periodontitis (Model PD-II), stage III periodontitis (Model PD-III), stage IV periodontitis (Model PD-

219 IV), periodontitis above stage I (stage II, III, and IV; Model PA-I), and periodontitis above stage II
 220 (stage III, and IV; Model PA-II) were constructed using the proteins and microbial profiles that
 221 showed significant differences.
 222

223 **Table 2.** The sensitivity, specificity, and accuracy of each prediction model.

Total	Clinical final diagnosis		Prediction Model		FP	FN	Sensitivity		Specificity		Accuracy	
121	HC	28	-	-	-	-	-	-	-	-	-	-
	Periodontitis	93	PD	117	24	0	1.000	(93/93)	0.143	(4/28)	0.802	(97/121)
	PS-I	24	PD-I	4	3	23	0.042	(1/24)	0.969	(94/97)	0.785	(95/121)
	PS-II	24	PD-II	5	5	24	0.000	(0/24)	0.948	(92/97)	0.760	(92/121)
	PS-III	23	PD-III	11	4	16	0.304	(7/23)	0.959	(94/98)	0.835	(101/121)
	PS-IV	22	PD-IV	9	2	15	0.318	(7/22)	0.980	(97/99)	0.860	(104/121)
	PS-II, III, & IV	69	PA-I	67	15	17	0.754	(52/69)	0.712	(37/52)	0.736	(89/121)
	PS-III & IV	45	PA-II	44	10	11	0.756	(34/45)	0.868	(66/76)	0.826	(100/121)

224 **Abbreviations:** HC: healthy controls; PS-I: stage-I periodontitis; PS-II: stage-II periodontitis; PS-III: stage-III
 225 periodontitis; PS-IV: stage-IV periodontitis; FP: False positive; FN: False negative.

226
 227 The Model PD mathematical formula with an accuracy of 0.802 (Table 2) was constructed to
 228 discriminate the periodontitis groups from the healthy group using a logistic regression analysis. This
 229 model showed high sensitivity (1.000), but low specificity (0.143) (Table 2).

$$\text{Model PD} = \frac{1}{1 + e^{-(-0.066 + 0.002 \cdot T\text{-MMP8} + 0.505 \cdot \text{En})}}$$

230
 231 The Model PD-I mathematical formula with an accuracy of 0.785 (Table 2) was constructed to
 232 diagnose the stage I periodontitis group from the healthy group and stage II, III, and IV periodontitis
 233 patients using a logistic regression analysis. This model showed high specificity (0.969) but low
 234 sensitivity (0.042) (Table 2).

$$\text{Model PD-I} = \frac{1}{1 + e^{-(-0.825 - 10.113 \cdot \text{Active-MMP8} - 10.125 \cdot \text{Pro-MMP8} + 10.117 \cdot \text{Total-MMP8})}}$$

235
 236 The Model PD-II mathematical formula with an accuracy of 0.760 (Table 2) was constructed to
 237 diagnose the stage II periodontitis group from the healthy group and stage I, III, and IV periodontitis
 238 patients using logistic regression analysis. This model showed high specificity (0.948) but low
 239 sensitivity (0.000) (Table 2).

$$\text{Model PD-II} = \frac{1}{1 + e^{-(-1.308 - 0.513 \cdot \text{Pm} + 0.293 \cdot \text{Cr})}}$$

240
 241 The Model PD-III mathematical formula with an accuracy of 0.835 (Table 2) was constructed to
 242 diagnose the stage III periodontitis group from the healthy group and stage I, II, and IV periodontitis
 243 patients using logistic regression analysis. This model showed high specificity (0.959) but low
 244 sensitivity (0.304) (Table 2).

$$\text{Model PD-III} = \frac{1}{1 + e^{-(-2.946 + 10.998 \cdot \text{Active-MMP8} + 10.999 \cdot \text{Pro-MMP8} - 10.999 \cdot \text{Total-MMP8} - 0.259 \cdot \text{Td} + 0.419 \cdot \text{Pm} + 0.419 \cdot \text{En})}}$$

245
 246
 247 The Model PD-IV mathematical formula with an accuracy of 0.860 (Table 2) was constructed
 248 to diagnose the stage IV periodontitis group from the healthy group and stage I, II, and III

249 periodontitis patients using logistic regression analysis. This model showed high specificity (0.980)
250 but low sensitivity (0.318) (Table 2).

$$\text{Model PD-IV} = \frac{1}{1 + e^{-(-12.023 + 0.004 \cdot \text{Pro-MMP8} + 0.427 \cdot \text{En} + 1.267 \cdot \text{Av})}}$$

251
252 The Model PA-I mathematical formula with an accuracy of 0.736 (Table 2) was constructed to
253 discriminate the stage II, III, and IV periodontitis groups from the healthy group and stage I
254 periodontitis patients using logistic regression analysis. This model showed improved sensitivity
255 (0.754) and specificity (0.712) (Table 2).

$$\text{Model PA-I} = \frac{1}{1 + e^{-(-1.635 + 0.005 \cdot \text{Pro-MMP8} + 0.193 \cdot \text{Cr} + 0.322 \cdot \text{En})}}$$

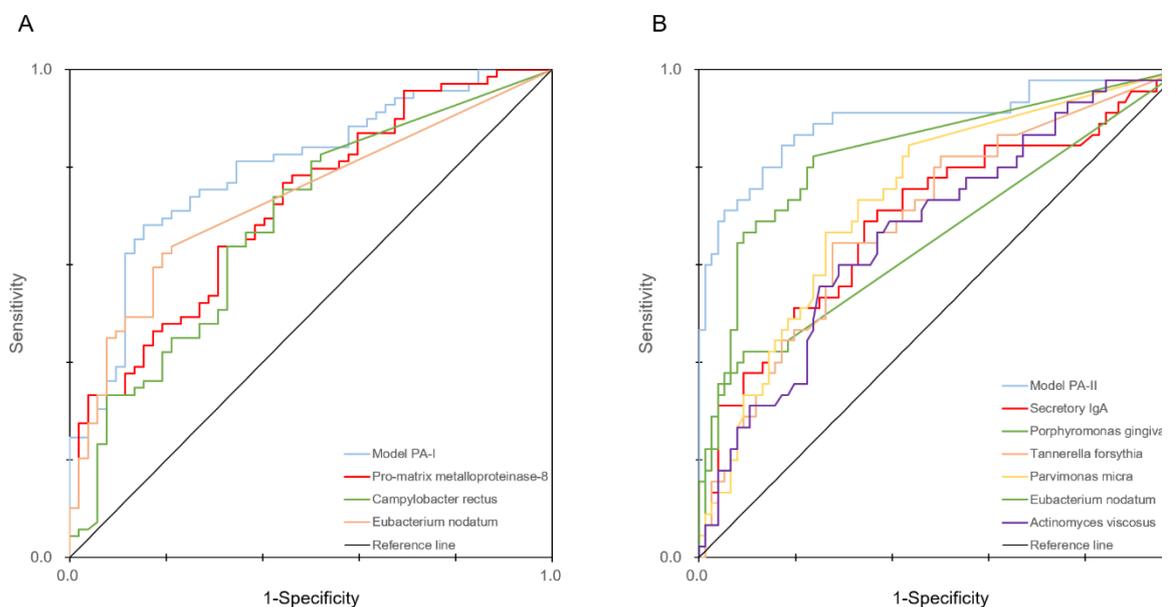
256
257 The Model PA-II mathematical formula with an accuracy of 0.826 (Table 2) was constructed to
258 discriminate the stage III and IV periodontitis groups from the healthy group and stage I and II
259 periodontitis patients using logistic regression analysis. This model showed good specificity (0.756)
260 and sensitivity (0.868) (Table 2).

$$\text{Model PA-II} = \frac{1}{1 + e^{-(-11.310 + 0.003 \cdot \text{sIgA} + 0.300 \cdot \text{Pg} - 0.302 \cdot \text{Tf} + 0.324 \cdot \text{Pm} + 0.675 \cdot \text{En} + 1.231 \cdot \text{Av})}}$$

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3.4. Validation of multianalyte models

Among the seven models, Model PA-I and Model PA-II, which showed good sensitivity and specificity, were further investigated with the ROC curves (Figure 3).



267 **Figure 3.** ROC curve of models above PA-I (A) and II (B). ROC curve of biomarkers significantly
268 related and included in each model were also included in each figure.

269
270 It was found that the models combining salivary biomarkers and microbiologic profiles were
271 useful for discriminating periodontal status. The AUC values of pro-MMP-8, *C. rectus*, and *E.*
272 *nodatum* were 0.720, 0.685, and 0.733, respectively. In contrast, the AUC value of model PA-I that
273 combined the markers showed that the 0.796. AUC values of sIgA, *P. gingivalis*, *T. forsythia*, *P. micra*,
274 *E. nodatum*, and *A. viscosus* were 0.695, 0.653, 0.694, 0.736, 0.831, and 0.673, respectively, while

275 Model PA-II that combined them showed an AUC value of 0.894. This section may be divided by
276 subheadings. It should provide a concise and precise description of the experimental results, their
277 interpretation as well as the experimental conclusions that can be drawn.

278

279 4. Discussion

280 In this study, we built the seven diagnostic models for periodontitis by combining meaningful
281 salivary biomarkers including cytokines and microbial profiles which significantly changed with the
282 stage of periodontitis. Among the seven models, PA-I and PA-II were both highly sensitive and
283 specific compared with PD-I, II, III and IV models. In model PA-I, *E. nodatum* and *C. rectus* were
284 included; these bacteria belong to the orange complex, which has a role in linking early colonizing
285 and pathogenic bacteria of chronic periodontitis. Therefore, it is thought that these bridging species
286 are very important in the diagnosis of periodontitis with stage II, III, and IV disease. Meanwhile, in
287 model PA-II, purple complex such as *A. viscosus*, orange complex such as *P. micra* and *E. nodatum*,
288 red complex such as *P. gingivalis* and *T. forsythia* were included. The high accuracy of model PA-II
289 means that overall planktonic bacterial species can increase when the severity of periodontitis
290 increases, because various species consisting of early colonizer, bridging species, and pathogenic
291 bacteria are included. Simple counting of bacteria also showed that there were more group of
292 streptococcus and *A. viscosus* in stage IV, meaning the more severe the stage of periodontitis is, the
293 more overall bacteria there are.

294 To our knowledge, there is little literature to validate a new classification system of periodontitis
295 in the development of a diagnostic method including salivary biomarkers. In 2017, the new
296 classification system for case definitions of periodontitis was developed and suggested based on
297 cumulative studies for almost 20 years [20]. In the workshop, three obviously different forms of
298 periodontitis based on pathophysiology were categorized: necrotizing periodontitis, periodontitis as
299 a direct manifestation of systemic disease, and periodontitis. Herein, we included the latter form. The
300 periodontitis stage increased according to the severity, complexity, extent and distribution of the
301 disease. Our prediction models for periodontitis showed the high accuracy based on this new
302 classification system by using limited amounts of significant biomarkers.

303 In this study, we included all forms of MMP-8. Several studies found that the active forms of
304 MMP could distinguish periodontitis [21,22]; however, in this study, all forms were significantly
305 different. The increase was considered to reflect the increased leakage of all types of MMP-8
306 according to the severity of periodontitis. Interestingly, CRP did not show a significant difference,
307 which was not consistent with other studies [23,24]. This might be because the detective capacity of
308 ELISA is not sensitive enough to detect the changes in level of CRP [25,26]. Therefore, to monitor the
309 level of CRP, more sensitive techniques should be used.

310 Our findings suggest that whole saliva can be used as a prospective diagnostic tool for
311 periodontitis. Additionally, the proper selection of biomarkers in whole saliva was important in order
312 to increase the sensitivity and specificity of the diagnosis of periodontitis [27,28]. On the other hand,
313 this method had limitations in the early diagnosis with stage I. Other studies also showed similar
314 limitations where the screening test could not distinguish early stage periodontitis [29]. By definition,
315 stage I periodontitis is a bridge between gingivitis and periodontitis; thus, it can show lower levels
316 of biomarkers than the severe forms. Other researchers tried to discriminate gingivitis and
317 periodontitis through macrophage inflammatory protein-1 α [30,31]. To overcome the problem, it was
318 necessary to find additional biomarkers or develop more sensitive detecting techniques for early
319 detection.

320 The diagnosis of periodontitis with clinical parameters is a very effective tool but it is time-
321 consuming and labor intensive. The evaluation of clinical parameters is somewhat difficult to
322 standardize and cannot monitor the real-time changes in periodontal disease progression [27,28].
323 Therefore, the method of whole saliva analysis could be an easier and simpler diagnostic tool for the

324 detection of periodontitis. Additionally, salivary biomarkers can be a very prospective screening tool
325 when one considers the high correlations between periodontitis and systemic disease [21,32,33].

326 Many researchers have reported the efficacy of GCF as a diagnostic method for chronic
327 periodontitis [34-36]. However, most of the sampling methods cannot be obtained quantitatively;
328 therefore, their reliability is considered low. At first, we tried but failed to obtain GCF quantitatively
329 because of the high viscosity of GCF. Therefore, to measure GCF quantitatively, it is necessary to
330 overcome these technical problems.

331 5. Conclusions

332 This study can contribute to screening for chronic periodontitis based on salivary biomarkers.
333 The PA-I and PA-II model using microbial profiles and cytokines showed an improved tool for the
334 diagnosis of periodontitis with whole saliva.

335

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341

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345

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347

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