



The Oral Microbiome in Periodontal Health

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Lenartova M, Tesinska B, Janatova T, Hrebicek O, Mysak J, Janata J and Najmanova L (2021) The Oral Microbiome in Periodontal Health. Front. Cell. Infect. Microbiol. 11:629723. doi: 10.3389/fcimb.2021.629723 The estimation of oral microbiome (OM) taxonomic composition in periodontally healthy individuals can often be biased because the clinically periodontally healthy subjects for evaluation can already experience dysbiosis. Usually, they are included just based on the absence of clinical signs of periodontitis. Additionally, the age of subjects is used to be higher to correspond well with tested groups of patients with chronic periodontitis, a disorder typically associated with aging. However, the dysbiosis of the OM precedes the clinical signs of the disease by many months or even years. The absence of periodontal pockets thus does not necessarily mean also good periodontal health and the obtained image of "healthy OM" can be distorted. To overcome this bias, we taxonomically characterized the OM in almost a hundred young students of dentistry with precise oral hygiene and no signs of periodontal disease. We compared the results with the OM composition of older periodontally healthy individuals and also a group of patients with severe periodontitis (aggressive periodontitis according to former classification system). The clustering analysis revealed not only two compact clearly separated clusters corresponding to each state of health, but also a group of samples forming an overlap between both well-pronounced states. Additionally, in the cluster of periodontally healthy samples, few outliers with atypical OM and two major stomatotypes could be distinguished, differing in the prevalence and relative abundance of two main bacterial genera: Streptococcus and Veillonella. We hypothesize that the two stomatotypes could represent the microbial succession from periodontal health to starting dysbiosis. The old and young periodontally healthy subjects do not cluster separately but a trend of the OM in older subjects to periodontitis is visible. Several bacterial genera were identified to be typically more abundant in older periodontally healthy subjects.

Keywords: oral microbiome, periodontal health, periodontitis, core microbiome, stomatotype, taxonomic composition, aging

INTRODUCTION

Periodontitis is the sixth most common disease worldwide (Frencken et al., 2017). The major forms of periodontal disease are gingivitis, chronic periodontitis (which can be the result of untreated gingivitis) and according to former classification also aggressive periodontitis, which differs from the chronic variant by faster and more extensive disease progression, lower age of patients, and obvious familial aggregation (Armitage and Cullinan, 2010; Van der Velden, 2017). Periodontal disease poses a set of inflammatory conditions affecting the tissues surrounding the teeth. It spreads from the gingiva into the deeper, supportive components of the periodontium: the gum, connective tissue, and the alveolar bone surrounding and supporting a tooth (Hernández et al., 2011), and in more severe cases it can lead to a tooth loss (Kirst et al., 2015). It is a complex infectious disease, where specific pathogenic bacteria growing in biofilms play a key role. It is thus the result of the interplay between subgingival biofilm and host immune response and is further affected by other local, environmental, and genetic factors (Griffen et al., 2012).

The oral cavity has, after the gut, the second largest and diverse microbiota harboring over 700 species of bacteria (Deo and Deshmukh, 2019). In health, the oral microbiome (OM) represents a well-balanced dynamic ecosystem that generally tends to keep within its typical values (Najmanova et al., 2021). The dysbiosis then leads to gingivitis and finally periodontitis (Hajishengallis, 2015). The microbial composition shift precedes the clinical signs of the disease (Liu et al., 2012). The relationship between specific groups of taxa and periodontitis has been thoroughly studied: The OM undoubtedly associated with severe periodontitis is characterized by the presence of the so-called "red complex" bacteria: Porphyromonas gingivalis, Tannerella forsythia, and Treponema denticola (Socransky et al., 1998). Other bacteria highly abundant in periodontal disease belong to the phyla Synergistetes, Firmicutes, Bacteroidetes, Chloroflexi (Griffen et al., 2012; Abusleme et al., 2013; Pérez-Chaparro et al., 2014; Kirst et al., 2015). On the other hand, only a few taxa have been unambiguously associated with periodontal health - mainly some members of genera Actinomyces and Streptococcus (Griffen et al., 2012; Abusleme et al., 2013; Kirst et al., 2015; Meuric et al., 2017). In addition, little is known about the succession of steps leading from periodontal health to disease. For many taxa, the unambiguous assignment to periodontal health or periodontitis has proven difficult because they often exhibited equal prevalence and relative abundance in both states of health. These include the highly abundant Fusobacterium nucleatum, Veillonella parvula and some members of *Streptococcus* sp., but also the less frequent Lautropia mirabilis, Campylobacter gracilis, or Granulicatella adjacens, (Abusleme et al., 2013; Tsai et al., 2018). The reason could be that in the studies the "periodontal health" is often characterized rather as opposite to periodontitis, i.e. the absence of clinical signs of the disease. Mainly the older cohort of healthy controls, however, could already experience the dysbiosis even though yet without clinical symptoms. Another substantial problem is posed by inconsistent criteria for the diagnosis of patients (variable depth and a number of periodontal pockets required for assignment to periodontitis group, individual experience of examining periodontologist) (Pérez-Chaparro et al., 2014; Deo and Deshmukh, 2019). Previously we tried to solve the problem by assignment of the taxa to the health state using a selection of the most diseased patients from a wider cohort, and, as the opposite a selection of healthy individuals with taxonomically most distant OM (Najmanova et al., 2021). A panel of thirty oral taxa undoubtedly associated with periodontitis corresponded well to previously published data but the list of taxa unambiguously assigned to periodontal health was surprisingly poor containing only seventeen species or so-called "combined taxa" (groups of taxa that could not be distinguished from each other by the used sequencing method). The assignment of dozens of other species frequently identified in the oral cavity thus remains questionable.

In this work, we aimed to describe a typical periodontally healthy oral microbiome and to extend the panel of oral taxa unambiguously associated with periodontal health. It is generally known, that changes in the OM composition naturally occur with aging (Feres et al., 2016; Belibasakis, 2018) which is likely related to the fact, that chronic periodontitis manifests mainly in older people (Eke et al., 2016; Feres et al., 2016; López et al., 2017). To avoid a possible age bias, we employed in our study a cohort of 91 periodontally healthy students of dentistry, i.e. young subjects (average age 23 years) having a very high standard of oral hygiene and thus with lower risk of dysbiosis (HY; healthy young). To verify the impact of age on the taxonomic OM composition, we also analyzed a group of 17 samples from periodontally healthy subjects older than 40 years (HO; healthy old), and for comparison, we also included a group of 45 patients with severe (former aggressive) periodontitis (AP). Two distinct health-associated microbial communities were identified and the dysbiotic changes that could lead to periodontitis onset were described.

MATERIALS AND METHODS

Characteristics of Human Subjects and Sample Collection

Samples from 153 subjects were included and analyzed in this study (**Supplementary Table 1**): 91 periodontally healthy students of dentistry from the 1st faculty of medicine, Charles University in Prague (average age 23 years, marked HY), 17 periodontally healthy people older than 40 years (average age 46 years, marked HO), and 45 patients with severe (former aggressive) periodontitis (average age 33, marked AP). All subjects live in Czech Republic, but besides being students of the same university in HY group, they have no other general relation among each other in terms of living area, employment or any similar parameter. All subjects were examined by a single experienced periodontologist. To be included in the HY or HO group the subjects were required to have no periodontal pocket on probing depth >3 mm, in AP group the subjects had at least two periodontal pockets on probing depth >5mm. The subjects

had not received any antibiotic treatment or periodontal therapy in the three months before the beginning of the study. The HO and AP subjects were obtained within the study approved by the Ethics Committee of the First Faculty of Medicine of Charles University and General University Hospital in Prague as a part of project No. 17-30753A of the Czech Health Research Council and besides periodontitis in the AP group, they were of good general health, the sampling of HY subjects was approved within a project No. 486417 from the Grant Agency of Charles University. All subjects involved in the study signed the informed written consent.

The healthy subjects were sampled from the vestibular side of sulcus gingivalis, the samples from patients with severe periodontitis (AP) were taken from the deepest periodontal pocket. The healthy subjects fulfilled the criteria of periodontal health, as defined by Caton et al., (Caton et al., 2018), i.e. no positive bleeding on probing index (BOP), and no signs of inflammation (erythema and edema), the PPD (periodontal pocket depth) was < 2 mm, as well as the CAL (clinical attachment loss) index. The probands included in the AP group have never been treated for periodontitis prior to inclusion in our study and according to their clinical examination, their severe periodontitis diagnosis was confirmed. The clinical examination contained PPD, BOP, CAL (Supplementary Table 1), evaluation of the plaque and tartar amount (low for all probands), number of teeth after preservation treatment (low number of teeth with dental filling for all probands), rtg examination (prevailing vertical character of bone resorption) and family anamnesis with predominated preterm teeth loss in parents of our probands before the age of forty.

Additional information on the tooth sampled (identification of sampled tooth, CAL, BOP, PPD) and other relevant conditions including health state, smoking status, pregnancy, nationality or specific diet are listed in the **Supplementary Table 1**. The descriptive statistics on demographics and clinical data related to tested subjects is given at list "descriptive statistics" of this **Supplementary Table 1**. Each sample was obtained using two sterile paper points (BECHT, Germany). The paper points were left in the gingival sulcus or periodontal pockets for 10s to soak the fluid. Both paper points from one sampling were stored together in -20°C prior to further processing.

DNA Isolation, 16S rDNA Gene Library Preparation, and Sequencing

The DNA was extracted using DNeasy Blood&Tissue kit (Qiagen, Germany) according to the modified manufacturer's instructions (decreased final elution volume of AE buffer from 200 to 120 μ l) and stored in -20°C. Isolated DNA was used as a template for PCR 16S rDNA amplification. The universal primers 530f (GTGCCAGCMGCNGCGG) (Dowd et al., 2008) and 907R (CCGTCAATTCMTTTGAGTTT) (Lane et al., 1985) were used to amplify the V4-V5 region of bacterial 16S rDNA in primary PCR. Primers for secondary PCR amplification contained additionally five to seven nucleotide long sample

tags, separated from primers by two nucleotide long spacers (Supplementary Table 2). PCR reactions were performed in two steps according to Baldrian et al. (Baldrian et al., 2012). First PCR amplification was performed in 3 independent reactions for each sample in 12,5 µl Plain Combi PP Master Mix (Top-Bio, Czech Republic) containing 0,4% Phusion polymerase (New England Biolabs, USA) with 2 μ l of template, 2 μ l of each primer (0.25 mM) and 6,5 µl H₂O. Cycling conditions were 94°C for 5 min; 35 cvcles of 94°C for 1 min, 58°C for 50 s, 72°C for 30 s, followed by 72°C for 10 min. Pooled PCR products were purified after the electrophoretic separation from the agarose gel using the Wizard SV Gel and PCR Clean-Up System (Promega, USA). 3 µl of isolated DNA were used as a template in the second PCR in reaction containing 2 µl of each tagged primer and 25 µl of Plain Combi PP Master Mix enriched by Phusion DNA polymerase and 18 µl of H₂O. Cycling conditions were the same except that cycle number was 10 and number of independent reactions per sample was two. PCR products were separated by electrophoresis and purified using the Wizard SV Gel and PCR Clean-Up System and then concentrated into the volume of 16 µl using the MinElute PCR Purification Kit (QIAGEN, Germany). The concentration of DNA was measured by Qubit 2.0 Fluorometer using dsDNA BR Assay Kit (both Thermo Fisher Scientific, USA). The purified solutions of tagged amplicons from different samples were mixed in equimolar concentrations, the amplicon library was constructed using TruSeq DNA Library Preparation Kit v2 (Illumina, USA) and sequenced by Illumina MiSeq platform (paired-end reads, 2×250 bp).

Analysis of the Sequencing Data

The amplicon raw sequencing data were processed using the pipeline SEED 2.0.3 (Větrovský et al., 2018). The pair-end reads were joined using fastq-join program as a part of ea-utils package (Aronesty, 2013). All sequences were trimmed to 365 nt starting from the first nucleotide after the end of the forward primer sequence. The trimmed sequences were further clustered to 98.5% sequence identity by USEARCH (Edgar, 2010) implemented in SEED and the chimeric sequences were removed (chimera check is a part of the clustering method using Uparse algorithm). The quality-filtration to the mean quality Phred score treshold 30 was applied. Consensus sequences were constructed for each cluster and then compared to HOMD database (Chen et al., 2010) using the Blastn tool. Because not the whole length, but only a 365 nt long portion of the 16S rDNA sequence was analyzed, more human oral taxa (HMTs) often cluster to each consensus at the 98.5% level of identity resulting in the ambiguous taxonomic assignment. To overcome this problem, we defined the "combined taxa" (CTs) in cases when the precise assignment to a single HMT was not possible. The CTs were defined as follows: 889 sequences from HOMD version 14.51 were trimmed to 365 nt equally to our testing sequences and clustered at 98.5% identity resulting in 293 single HMTs and 106 clusters containing from 2 to 15 HMTs. These clusters were named CT1 - CT106 (Supplementary Table 3). The identified numbers

of reads per each taxon were further normalized to taxon relative abundance value with respect to a 16S rDNA copy number per genome. This procedure was demonstrated to result in a more realistic estimate of the relative abundances of the bacterial taxa, as it takes into account the variation of 16S rDNA copy numbers among taxa (ranging from 1 to 15). The bacterial genome count estimates were calculated based on the 16S rDNA copy numbers in the closest available sequenced genome as described previously by Vetrovsky and Baldrian (Větrovský and Baldrian, 2013). For the purposes of this publication, the published table of the 16S rDNA copy numbers was extended using rrnDB database (Stoddard et al., 2015) (Supplementary Table 4). The sequencing statistics including diversity indices and rarefaction curves is summarized in Supplementary Table 7). The raw sequences are deposited in the NCBI Short Read Archive (BioProject accession no. PRJNA670573).

Bioinformatic Analysis

The Weighted Jaccard Similarity clustering analysis (Figure 1) was performed using the Python programming language (Rossum and Drake, 2010), specifically the NetworkX library (Hagberg et al., 2008). The network graph was generated based on **Supplementary Table 5**, which displays the relative persample abundances of all taxa, with abundances below 0.05% rounded down to zero as insignificant. To reduce the dimensionality of the data, a similarity matrix was calculated between all samples using an abundance-weighted Jaccard similarity index. This highlighted the similarities in the overall composition of the biofilm, rather than taxonomic diversity. In other words, the impact of low-abundance taxa on the similarity metric was reduced. For visualization, the aforementioned NetworkX library was used to create a network graph. The generated graph is unweighted, meaning a shorter distance



between nodes does not always reflect greater similarity. Links were displayed only between nodes with a similarity index of 0.3 or greater.

The PCA (**Figure 3**) and multivariate clustering analysis (**Figure 4**) were performed in the free statistical software PAST 3.25 (Hammer et al., 2001) using the processed sequencing data summarized in **Supplementary Table 5**. The paired group (UPGMA) algorithm and the Bray-Curtis similarity index were employed to obtain **Figure 4**. The statistical significance of identified group characteristics was further analyzed using one-way PERMANOVA test of CLR (central log ratio) transformed data in PAST 3.25. A SIMPER (Similarity Percentage) test within PAST 3.25 software was used for assessing which taxa are primarily responsible for observed differences between groups of samples and One-way ANOVA with Dunn's *post hoc* test was employed to assess the statistical significance of individual taxa relative abundance difference among groups identified by multivariate clustering analysis (**Supplementary Table 6**).

RESULTS

The sequencing statistics is summarized in the Supplementary Table 7. In average we obtained 11334 reads/sample for HY group, 16709 for HO group, and 11974 for AP group with minimum 1006 reads/sample. The rarefaction curves were calculated for a random selection of 1000 sequences to reflect the minimum sample size, set up to cover the expected relevant taxonomic diversity of oral microbiome samples (the sequencing was repeated when the number of reeds per sample was < 1000 to ensure identification of all taxa exceeding average relative abundance 0.5%). The diversity, evenness, and species richness parameters were estimated for each sample (Supplementary Table 7) and were compared also between HY HO and AP groups using one-way ANOVA with Dunn's post hoc test. No statistically significant difference was identified for any parameter except for the Chao-1 richness, statistically significantly higher in HY group when compared to AP (p = 0.002); for HY/HO and HO/HP p was > 0.05.

Healthy and Diseased Samples Cluster Mostly Separately but Few of Them Are Always Misclassified

All 153 samples were clustered using Weighted Jaccard Similarity analysis, index value 0.3 (**Figure 1**). For each sample, all taxa with relative abundance value >0.05% were included in the analysis. Two major distinct clusters were observed: the periodontitis-associated cluster containing mainly samples of AP patients (red spots in **Figure 1**) and the health-associated cluster covering mainly subjects without clinical signs of the disease (green and yellow spots in **Figure 1**) with several samples from all three cohorts localized in the area in between. The periodontitis-associated cluster contains 39 samples (35 AP and 4 HO), the health-associated cluster includes 86 samples (72 HY, 11 HO, and 3 AP). Twenty-seven samples are localized in the area connecting both the above-mentioned clusters (transient area, dashed line in **Figure 1**) and one sample (AP30) was an outlier, not included in further analysis. The transient area contains 6 AP and 21 H samples (19 HY + 2 HO). The one-way PERMANOVA test confirmed the difference among the healthy, periodontitis and transient groups with p=0.0001 for all mutual comparisons.

In the health-associated cluster, the most abundant and prevalent taxa are CT2 Streptococcus mitis/S. oralis, CT43 Streptococcus gordonii/S. sanguinis, CT6 Veillonella dispar/V. parvula, CT25 Neisseria flava/N. mucosa, CT27 Neisseria subflava, HMT14 Neisseria oralis, HMT718 Haemophilus parainfluenzae, CT23 Haemophilus haemolyticus, CT24 Haemophilus sputorum, CT10 Prevotella histicola, CT37 Gemella morbillorum, CT48 Rothia dentocariosa, HMT22 Lautropia mirabilis, HMT37 Stenotrophomonas nitritireducens, and CT13 Aggregatibacter aphrophilus (Table 1). The relative abundance and in most cases also the prevalence of these taxa remarkably decreases toward the transient area and periodontitisassociated cluster. On the other hand, the relative abundance and prevalence of taxa typical for periodontitis do not reach high values in periodontal health and transient area, but the increasing trend from the health, through the transient area to the periodontitisassociated cluster is noticeable. Several taxa exhibit the highest abundance and prevalence in subjects from the transient area, namely CT3 Fusobacterium nucleatum, CT8 Porphyromonas pasteri/P. catoniae, HMT775 Capnocytophaga sputigena, HMT329 Capnocytophaga leadbetteri and CT51 Capnocytophaga granulosa, HMT311 Prevotella oris, CT53 Tannerella sp. and HMT623 Campylobacter gracilis.

Even though no obvious age-dependent clustering pattern was observed, still 35% of samples from HO group (6 out of 17), clustered together with AP or in close proximity (yellow spots in Figure 1), but no HY sample clustered together with AP. We compared the OM taxonomic composition of these 6 HO samples (HO3, 7, 12-14, and 16; highlighted in Supplementary Table 5) with a group of remaining 102 samples from healthy individuals (HY and HO) and also a group of 45 AP samples. The OM of these 6 HO samples resembles the diseased one, just the relative abundance and prevalence values of main periodontitis-associated taxa (red-complex taxa, Fretibacteria CT12, and HMT 363, and Filifactor alocis HMT 539) are slightly lower when compared to the AP group. On the other hand, the average relative abundance of Fusobacterium nucleatum is higher in these six samples. The taxa typical for periodontal health (CT2 Streptococcus mitis/S. oralis, CT6 Veillonella dispar/V. parvula, CT25 Neisseria flava/N. mucosa) are almost absent exhibiting the average relative abundance values comparable to the AP group. Even though the 6 HO individuals did not exhibit any clinical signs of the disease, their OM taxonomic composition indicates a high risk of periodontitis development in the future.

The OM Taxonomical Composition in Aging

The relative abundance values of selected taxa in relation to the age and state of health are compared in **Figure 2** and summarized including the prevalence data in **Table 2**. Three groups of samples were compared: HY (average age 23), HO

TABLE 1 | The average relative abundance and representation of selected taxa in the health-associated cluster, transient area, and periodontitis-associated cluster.

HMT/CT	health-associated cluster		transient area		periodontitis-associated cluster	
	average abundance [%]	prevalence [%]	average abundance [%]	prevalence [%]	average abundance [%]	prevalence [%]
CT2 Streptococcus mitis; S. oralis	20.87	100.00	4.37	96.30	0.52	48.72
CT6 Veillonella dispar; V. parvula	15.19	100.00	5.15	100.00	0.51	53.85
CT25 Neisseria flava; N. mucosa	6.54	88.37	2.37	74.07	0.89	28.21
CT43 Streptococcus gordonii; S.	4.97	100.00	0.65	74.07	0.12	33.33
sanguinis						
HMT718 Haemophilus parainfluenzae	4.83	96.51	0.60	70.37	0.05	20.51
CT10 Prevotella histicola	2.48	84.88	0.71	77.78	0.17	38.46
CT27 Neisseria subflava	2.45	87.21	0.61	77.78	0.24	38.46
HMT14 Neisseria oralis	2.43	53.49	1.50	62.96	0.12	23.08
CT37 Gemella morbillorum	2.18	89.53	1.09	85.19	0.10	33.33
CT48 Rothia dentocariosa	1.95	74.42	0.31	37.04	0.17	17.95
HMT22 Lautropia mirabilis	1.93	80.23	0.40	62.96	0.09	25.64
CT23 Haemophilus haemolyticus	1.44	80.23	0.27	62.96	0.02	5.13
HMT37 Stenotrophomonas	1.13	69.77	0.05	22.22	0.09	10.26
nitritireducens	1.10	00.11	0.00		0.00	10.20
CT24 Haemophilus sputorum	1.07	66.28	0.17	44.44	0.00	5.13
CT13 Aggregatibacter aphrophilus	1.00	56.98	0.43	59.26	0.14	17.95
CT3 Fusobacterium nucleatum	4.76	97.67	31.30	100.00	23.32	100.00
CT8 Porphyromonas pasteri; P.	2.15	82.56	13.05	92.59	0.37	41.03
catoniae	2.10	02.00	10.00	92.39	0.07	41.03
HMT775 Capnocytophaga sputigena	1.37	63.95	2.63	77.78	0.09	23.08
HMT329 Capnocytophaga leadbetteri	0.56	44.19	1.91	62.96	0.12	25.64
HMT329 Caphocytophaga leadbetten HMT311 Prevotella oris	0.26	34.88	1.20	55.56	0.68	20.51
	0.20	34.88	1.15	66.67	0.32	43.59
CT51 Capnocytophaga granulosa	0.23	34.00	1.06	59.26	0.32	43.59 33.33
CT53 <i>Tannerella</i> sp.			1.08	59.20 88.89		
HMT623 Campylobacter gracilis	0.38	43.02			0.35 12.15	64.10
HMT619 Porphyromonas gingivalis	0.02	6.98	0.13	14.81		74.36
HMT613 Tannerella forsythia	0.01	5.81	0.21	25.93	7.29	100.00
CT12 Fretibacterium sp.	0.00	2.33	0.13	37.04	6.55	97.44
CT50 Treponema denticola	0.02	8.14	0.30	25.93	5.91	94.87
CT22 Porphyromonas endodontalis	0.20	13.95	1.34	37.04	4.17	94.87
CT7 Treponema vincentii	0.02	9.30	0.78	44.44	3.59	92.31
CT11 Treponema socranskii	0.04	13.95	0.90	48.15	3.25	100.00
HMT643 Prevotella intermedia	0.20	5.81	2.04	25.93	2.70	74.36
HMT274 Bacteroidales [G-2] sp.	0.13	11.63	0.29	37.04	2.38	69.23
HMT539 Filifactor alocis	0.05	6.98	0.03	18.52	1.57	89.74
CT56 Campylobacter rectus	0.17	36.05	0.99	70.37	1.49	87.18
HMT363 Fretibacterium fastidiosum	0.01	2.33	0.04	14.81	1.46	97.44
CT42 Treponema maltophilum	0.00	3.49	0.05	18.52	1.17	94.87

The oral taxa predominantly abundant and prevalent in the health-associated cluster are marked green. Taxa with the highest abundance and representation in the transient area are gray and the taxa with the highest average relative abundance and prevalence in the periodontitis-associated cluster are red. The table includes only the taxa with minimal average relative abundance >1% and minimal prevalence >50% in at least one cluster. CT stands for combined taxon (See Supplementary Table 3).

(average age 46), and patients with AP (average age 33). The oneway PERMANOVA test revealed clear difference between groups. When Bray-Curtis was used as a similarity index, the HY and HO were found close to each other (0.0059) but clearly different from AP (0.94 and 0.86, resp.). Twelve taxa were identified to be the most abundant in HY: CT6 Veillonella dispar/V. parvula, CT8 Porphyromonas pasteri; P. catoniae, CT25 Neisseria flava/N. mucosa, HMT718 Haemophilus parainfluenzae, CT43 Streptococcus gordonii/S. sanguinis, CT10 Prevotella histicola, CT27 Neisseria subflava, CT37 Gemella morbillorum, HMT14 Neisseria oralis, HMT22 Lautropia mirabilis, CT48 Rothia dentocariosa, and CT23 Haemophilus haemolyticus. A nicely visible gradual trend of diminution can be seen in the abundance and in most cases also in prevalence of these taxa toward to group of HO and patients with AP. On the other hand, in the AP group the highest abundance of periodontitisassociated taxa CT3 Fusobacterium nucleatum, CT7 Treponema vincentii, CT11 Treponema socranskii, CT50 Treponema denticola, CT12 Fretibacterium sp., CT22 Porphyromonas endodontalis, HMT619 Porphyromonas gingivalis, CT56 Campylobacter rectus, HMT274 Bacteroidales [G-2] sp., HMT363 Fretibacterium fastidiosum, HMT539 Filifactor alocis, HMT613 Tannerella forsythia, and HMT643 Prevotella intermedia was identified with an opposite trend of subsequent decreasing of the abundance and prevalence of these taxa toward to HO and then to HY subjects. Only a few bacterial taxa were found to prevail in the group of HO samples: CT2 Streptococcus mitis/S. oralis, CT51 Capnocytophaga granulosa, HMT329 Capnocytophaga leadbetteri, HMT775 Capnocytophaga sputigena, and HMT322 Bergeyella sp.



TABLE 2 | The comparison of the relative abundance and prevalence of significant oral taxa according to the age (HY vs HO) and state of health (HY, HO and AP).

HMT/CT	нү		НО		AP	
	average abundance [%]	prevalence [%]	average abundance [%]	prevalence [%]	average abundance [%]	prevalence [%]
CT6 Veillonella dispar; V. parvula	13.37	100.00	10.87	100.00	1.46	60.00
CT8 Porphyromonas pasteri; P.	5.19	85.71	1.59	88.24	1.19	44.44
CT25 Neisseria flava: N. mucosa	5.44	83.52	3.03	94.12	2.66	35.56
HMT718 Haemophilus parainfluenzae	4.02	92.31	2.47	88.24	0.56	26.67
CT43 Streptococcus gordonii; S. sanguinis	3.98	96.70	2.35	82.35	1.27	40.00
CT10 Prevotella histicola	2.37	84.62	0.77	82.35	0.25	42.22
CT27 Neisseria subflava	2.31	86.81	1.09	76.47	0.38	44.44
CT37 Gemella morbillorum	2.27	89.01	0.43	94.12	0.16	37.78
HMT14 Neisseria oralis	2.17	54.95	0.77	64.71	1.09	26.67
HMT22 Lautropia mirabilis	1.82	82.42	0.23	47.06	0.25	31.11
CT48 Rothia dentocariosa	1.64	68.13	1.05	52.94	0.43	24.44
CT23 Haemophilus haemolyticus	1.37	81.32	0.38	64.71	0.01	6.67
CT2 Streptococcus mitis; S. oralis	16.94	100.00	18.38	100.00	1.95	53.33
CT51 Capnocytophaga granulosa	1.04	40.66	1.24	58.82	0.24	20.00
HMT322 Bergeyella sp.	0.60	70.33	1.73	70.59	0.04	13.33
HMT329 Capnocytophaga leadbetteri	0.68	48.35	1.63	58.82	0.32	24.44
HMT775 Capnocytophaga sputigena	1.74	64.84	1.39	82.35	0.23	26.67
CT3 Fusobacterium nucleatum	9.48	98.90	17.23	100.00	22.44	97.78
CT7 Treponema vincentii	0.05	12.09	0.71	35.29	3.25	88.89
CT11 Treponema socranskii	0.17	17.58	0.75	47.06	2.80	88.89
CT12 Fretibacterium sp.	0.01	5.49	1.03	35.29	5.36	88.89
CT22 Porphyromonas endodontalis	0.40	9.89	1.45	58.82	3.46	91.11
CT50 Treponema denticola	0.02	4.40	1.11	47.06	4.90	86.67
CT56 Campylobacter rectus	0.38	40.66	0.63	64.71	1.21	82.22
HMT274 Bacteroidales [G-2] sp.	0.16	13.19	0.98	47.06	1.79	60.00
HMT363 Fretibacterium fastidiosum	0.01	3.30	0.38	35.29	1.14	77.78
HMT539 Filifactor alocis	0.05	5.49	0.16	41.18	1.32	75.56
HMT613 Tannerella forsythia	0.04	3.30	1.07	52.94	5.99	88.89
HMT619 Porphyromonas gingivalis	0.03	3.30	1.44	29.41	10.04	68.89
HMT643 Prevotella intermedia	0.10	2.20	1.97	47.06	3.00	71.11

The taxa prevailing in each group are highlighted in respective color: green for HY, peach for HO, and red for AP. The table includes only taxa with minimal average relative abundance >1% and minimal prevalence >50% in at least one group. CT stands for combined taxon (See Supplementary Table 3).

The Stomatotypes in Oral Health and Disease

All 153 samples were analyzed using principal component analysis (PCA; **Figure 3**) and hierarchical clustering analysis based on the Bray-Curtis similarity indexes (**Figure 4**). All identified taxa in each sample were taken into account in the calculation of sample distance. In addition, in this case, the majority of AP samples form a compact cluster (red triangles in **Figure 3**) apart from a much more diffuse group of healthassociated spots (green dots and yellow squares in **Figure 3**). The inner panel in **Figure 3** shows the contribution of individual taxa to the distribution of samples.

The clustering analysis based on Bray-Curtis similarity indexes revealed two superclusters (**Figure 4**), one associated mainly with periodontal health and the second with periodontitis. The health-associated supercluster comprises two main clusters of equal size (Cluster 1 and Cluster 2) and two small clusters (Cluster 3a and 3b) corresponding to outliers from **Figure 1**. The periodontitis-associated supercluster comprises also two main clusters: Cluster 4 corresponding to the transient state, and Cluster 5 corresponding to periodontitis (compare to **Figure 1**). Using one-way PERMANOVA test, the Clusters 3a and 3b were not found to differ significantly from each other (p = 0.33), however, when considering the Clusters 1 and 2 (health-associated), 4 (transient) and 5 (periodontits-associated), they all mutually differ significantly (p = 0.0001). The determining taxa for each cluster are listed in **Figure 4** and in more detail in **Supplementary Table 6**. For twenty most discriminating taxa according to Simper test also One-way ANOVA with Dunn's *post hoc* test was employed to compare the clusters (**Supplementary Table 6**; individual lists; statistically significant results are highlighted in red).

Predictably, the periodontitis associated cluster Cluster 5 is characterized by the high relative abundance of CT3 *F. nucleatum*, CT12 *Fretibacterium* spp., and red complex taxa HMT619 *P. gingivalis*, HMT613 *T. forsythia*, and CT50 *T. denticola*. Also, the transient state-associated cluster Cluster 4 is characterized by the high relative abundance of CT3 *F. nucleatum*, but in this case, accompanied by CT8 *Porphyromonas pasteri/catoniae* and no red-complex taxa. Two



main health-associated clusters are Cluster 1 (characterized by CT2 *Streptococcus mitis/oralis* and *Haemophilus* spp. HMT718, CT23, and CT24) and Cluster 2 (characterized by CT6 *Veillonella rogosae/dispar, Neisseria* spp. CT25, CT27, and CT37 *Gemella morbillorum*). This distribution corresponds well also with the main taxa driving the PCA distribution (the inner panel in **Figure 3**). In contrast to the periodontitis-associated cluster, the two health-associated stomatotypes are not conclusively distinguished. They rather form a diffuse group covering all possible combinations of health-associated taxa.

DISCUSSION

Misclassification of Samples

The Weighted Jaccard Similarity analysis (**Figure 1**), as well as the PCA analysis (**Figure 3**), expectedly distinguished a compact cluster of AP samples from a bigger and more diffuse cluster of samples of healthy individuals. A similar trend was observed earlier (Kirst et al., 2015) and it was explained as a result of microbial succession during the onset of periodontal disease. Kirst et al. revealed that shallow sampling sites in patients with chronic periodontitis exhibited the highest species richness and diversity (containing both, the health-associated taxa as well as the taxa typical for periodontitis), while the deep periodontal pockets contained only a limited number of species that were, moreover, quite uniform among the tested individuals. The healthy sites were also less diverse, but the individuals differed more, which could result from an ambiguous diagnosis of some healthy probands, in whom the early stages of dysbiosis can occur without any clinical signs. In our study, in order to characterize a periodontally healthy oral microbiome, we included the HY group, selected on purpose from young people with precise oral hygiene, i.e. with a very low probability of dysbiosis that could otherwise bias the results. To contrast with the former, we also included a group of severe periodontitis (AP) patients who are typically characterized by unambiguous diagnosis, deep periodontal pockets, and a rapid progression of the disease. Nevertheless, even with such a welldistinguished set of individuals, still, several HY samples cluster close to the AP group. From the HO group, in which the dysbiosis preceding the periodontitis development could already be expected, four samples cluster directly within the AP group (Figure 1), and few AP samples, on the other hand, cluster together with the healthy ones. The PCA analysis shows an even bigger overlap (Figure 3).

A similar discrepancy between the microbial profile and clinical status in some percentage of samples was already shown previously (Kirst et al., 2015; Park et al., 2015; Szafranski et al., 2015). PCA or PCoA analysis frequently revealed a compact cluster of samples from periodontitis patients, a bigger and more diffuse cluster of samples from periodontally healthy individuals, and several outliers or



FIGURE 4 | Hierarchical clustering of all OM samples based on the Bray-Curtis similarity indexes. AP samples are marked red, HO black, and HY green. The upper measure indicates the Bray-curtis value. The determining taxa for each cluster are listed. CT stands for combined taxon (See Supplementary Table 3).

samples assigned to an improper group. In our study, ~18% of samples did not belong to any of the identified AP or healthy cluster but form a connection between them (Figure 1). We suppose that these samples represent a transient state. The clinically healthy subjects (HY and HO) from the transient area and the four HO samples clustering with AP would thus probably experience dysbiosis and consequently would be at a higher risk of periodontitis onset, while the AP samples from the transient area could correspond to a milder course of the disease or patients with better prognosis. Nevertheless, we must consider also the possibility of altered functional activity of the OM as discussed for example by Duran-Pinedo (Duran-Pinedo and Frias-Lopez, 2015) and/or an unusual host immune response, more tolerogenic in case of healthy subjects with unhealthy OM and more proinflammatory in AP subjects with transient OM (Sultan et al., 2018).

Four AP samples from our set were misclassified: One outlier (AP30), and three samples localized within the health-associated cluster in Figure 1 (AP26, AP35, and AP44). The outlier AP30 exhibited very high relative abundance (44%) of CT98 Propionibacterium propionicum (Supplementary Table 5; list AP). The high relative abundance of *P. propionicum* is by some authors correlated with apical periodontitis and endodontal lesions, however, this finding has not been corroborated by others, and there is no consensus concerning the role of P. propionicum in the pathogenesis of the periodontal disease (Dioguardi et al., 2020). The three remaining samples represented typical health-associated OMs and similarly to the AP30 they did not contain any of the above-mentioned "true periopathogens". Some authors explain this phenomenon with other causes of periodontal pocket formation then periodontitis, for example, anatomical abnormalities in labial frena (Monnet-Corti et al., 2018). This, however, is not the case of our patients. Two of them (AP26 and AP35) suffer from a localized form of the disease with 5 affected teeth, and two other (AP30 and AP44) have generalized AP with even 25 and 20 periodontal pockets, respectively. Such an extent of the disease cannot be caused by labial frena abnormalities. The severe periodontitis in these individuals thus probably originated from an unusual interplay between their OM and immune system. It is important to note, that the 16S rDNA sequencing-based taxonomic characterization of the OM provides a valuable, but still incomplete picture of the oral ecosystem. The bacteria are major and very important members of the OM, but fungi and archaea species also can play their role, and additionally, the metabolic activity of individual species can differ in relation to interactions with their surroundings (Sultan et al., 2018). Consequently, more complex diagnostic tools including proteomic or metabolomic studies will be required to reveal the cause of inflammation and periodontitis development in these nonstandard cases.

The most abundant and prevalent taxa in health and periodontitis-associated cluster are consistent with previously published data (Griffen et al., 2012; Abusleme et al., 2013; Pérez-Chaparro et al., 2014; Kirst et al., 2015). Slightly surprising could be very low prevalence of *Aggregatibacter actinomycetemcomitans* in our AP group (the taxon was identified only in three samples; 0.11% in AP24, 3.6% in AP12, and 15.8% in AP37), because for a

long time, this taxon has been typically associated with periodontitis, mainly with its severe (aggressive, according to former classification) form (Schacher et al., 2007; Henderson et al., 2010). Nevertheless, Henderson et al., also document, that the proportion of the population that harbors A. actinomycetemcomitans varies dramatically between various geographical areas and different clinical presentations of periodontitis. For example within Europe, 23% of Dutch subjects harbored A. actinomycetemcomitans compared to only 3% of Spanish subjects, on the other hand in Asia it was detected in 78% of healthy Vietnamese subjects. There is no general study concerning the prevalence of A. actinomycetemcomitans in periodontitis patients in the Czech Republic, however, with respect to the published geographical and ethnical variability, the low A. actinomycetemcomitans prevalence in our cohort does not put our diagnosis of severe (aggressive) periodontitis in question.

The OM of individuals in the transient area is characterized by the decreased relative abundance of typical health-associated taxa and increased relative abundance of anaerobic or facultative anaerobic taxa (genera Fusobacterium, Porphyromonas or *Capnocytophaga*), which are supposed to act as later colonizers, facilitating further colonization by "true periopathogens" of red complex (Socransky et al., 1998), and/or species of periodontitisassociated genera like Treponema, Fretibacterium, or Filifactor. The role of F. nucleatum in the subgingival biofilm formation probably lies in the bridging among microorganisms, allowing attachment of periodontitis-specific bacteria (Kolenbrander et al., 2006; Kolenbrander et al., 2010). The presence of F. nucleatum on its own does not cause periodontal disease, however, its increased abundance is undoubtedly associated with the disease (He et al., 2012; Yang et al., 2014). The second most abundant bacteria in samples from the transient area is CT8 Porphyromonas pasteri/ catoniae (13.05%). The genus Porphyromonas is quite unique because some Porphyromonas species are frequently associated with oral health (De Lillo et al., 2004; Camelo-Castillo et al., 2015; Takeshita et al., 2016; Yasunaga et al., 2017; Rusthen et al., 2019) while another member of the genus, Porphyromonas gingivalis, belongs to the red-complex and it is unequivocally disease-associated. Our results show that representatives of CT8 P. pasteri and/or P. catoniae do not form the core microbiome in oral health but rather indicate the transient state with an increased risk of periodontitis development. The genus Capnocytophaga is represented in samples from the transient state by three species: HMT 775 Capnocytophaga sputigena (2.63%), HMT329 Capnocytophaga leadbetteri (1.91%), and CT51 Capnocytophaga granulosa (1.15%). It is not a highly abundant genus but its relative abundance in healthy samples is remarkably lower and in periodontitis, it almost disappears. This finding is in good agreement with Pudakalkatti et al., who described Capnocytophaga species to be the most prevalent in gingivitis (a transient state from a clinical point of view) rather than in healthy periodontium and periodontitis (Pudakalkatti et al., 2016). They also claimed that Capnocytophaga has the potential to cause periodontal disease, but as it is less competitive in the periodontal pocket, it is usually overgrown by other rapidly growing bacteria. The role of Capnocytophaga is also supported by experiments published by Okuda et al., who proved that biofilm

formation by F. nucleatum is enhanced by a soluble factor produced by Capnocytophaga cells (Okuda et al., 2012). Another taxon exhibiting the highest average relative abundance and prevalence in the transient group is HMT311 Prevotella oris (1.20%), a taxon previously proved to co-aggregate with P. gingivalis and thus to promote the colonization of the gingiva by P. gingivalis in early stage of biofilm formation (Sato and Nakazawa, 2014). Finally, CT53 Tannerella sp. and HMT623 Campylobacter gracilis were also associated with the transient state. CT53 is comprised of three Tannerella species, two of them (HMT808, and HMT916) associated with periodontitis (Griffen et al., 2012; Beall et al., 2018), while HMT286 having a relationship to oral health (Leys et al., 2002). The 16S rDNA region sequenced in this study does not allow us to differentiate these three species, thus preventing the meaningful discussion of their role in the development of periodontitis. The average relative abundance of HMT623 C. gracilis in periodontal health and periodontitis is comparable and almost negligible (<0.4%). In transient state, it increased above 1% and also the prevalence was remarkably higher (89% compared to 43% and 64% in both border states). This finding corresponds well with previous association of C. gracilis with shallow periodontal pockets rather than the deeper ones (Macuch and Tanner, 2000). As a microaerophilic organism, which requires an environment that contains a reduced concentration of oxygen (Guillermo et al., 1996), C. gracilis could be, together with the above mentioned transient state-associated taxa, another supporting indicator of the initiating dysbiosis and increased risk of periodontitis development.

OM Changes in Aging

Belibasakis in his recent review summarized the knowledge concerning the OM composition changes in relation to the aging (Belibasakis, 2018) showing that relatively simple OM in early childhood is enriched by the acquisition of new taxa at an early predentate imprinting period and later during the eruption of primary teeth. During adult life, the OM composition of healthy individuals tends to keep a dynamically balanced state called "microbial homeostasis" comprising both natural and repeated colonization of the oral cavity by novel taxa without a remarkable effect on oral health. However, aging does result in changes to the host immune system, which in turn shifts the tolerance against microbial inhabitants of the oral cavity and which could consequently cause dysbiosis and periodontal disease. Besides the increasing prevalence of Actinomyces spp. in samples from older individuals (in spite of the increased prevalence of exposed root surfaces in higher age), no considerable differences in the OM composition were noted with regards to dental caries or periodontitis, between younger and elderly healthy populations (Belibasakis, 2018).

Our analysis, nevertheless, revealed several oral taxa clearly more abundant and/or prevalent in HO group when compared to the HY and opposite, even though the age difference between both groups of healthy individuals is not big (40-53 years with average 46 in HO group *vs.* 19-39 years with average 23 in HY). Generally, these changes could be summarized as an agingrelated gradual decrease of relative abundance of healthassociated taxa and an increase of taxa associated with the transient state. The most remarkable is the increasing relative abundance of CT3 F. nucleatum and Capnocytophaga species and decreasing relative abundance of health-associated Neisseria species, Lautropia mirabilis, Prevotella histicola or Gemella morbillorum (Table 2). Quite specific is a case of CT8 P. pasteri/P. catoniae, which average relative abundance clearly decreases with growing age (5.19% in HY vs. 1.59% in HO), but according to the Table 1 it is a typical taxon for the transient state (2.15% in health vs. 13.05% in a transient state and only 0.37% in periodontitis). When considering solely the HY group, the average relative abundance of CT8 in 19 transient samples is 15.9% while in 72 remaining samples it is only 2.35%. Similarly, in 6 AP samples in the transient area, the average relative abundance of CT8 is 6.49% while in the remaining 39 AP samples it is only 0.37%. Members of CT8 P. pasteri/P. catoniae belong to the so-called POTG (Porphyromonas other than gingivalis) group of microorganisms (Guilloux et al., 2020). Typically, they colonize lungs and lower airways and in some diseases like cystic fibrosis, the relative abundance of P. catoniae can serve as a marker to discriminate between various states of health (Cuthbertson et al., 2016). POTG and mainly CT8 taxa were also frequently identified in the oral cavity, but in contrast to P. gingivalis, they were associated with periodontal health (Abusleme et al., 2013; Camelo-Castillo et al., 2015). Our data, however, indicate, that the increased relative abundance of CT8 is rather a marker of the transient state directing to periodontitis (see small panel in Figure 3).

The increased average relative abundance of periodontitis associated taxa in HO samples corresponds well with frequently reported higher prevalence and severity of periodontal disease among older adults (Eke et al., 2012; Baelum and López, 2013; Eke et al., 2015; Feres et al., 2016; Ebersole et al., 2018). Generally, the aging comes with risk factors like a higher predisposition to other systemic diseases which can indirectly modulate the periodontal condition (Persson, 2018), the excessive immune response of the host to oral microbiota (Ebersole et al., 2016) resulting in aging-related moderate loss of periodontal attachment and alveolar bone (Burt, 1994) or higher incidence of the exposed root surfaces, facilitating overgrowth of opportunistic pathogens. The age was described to be a significant factor driving the OM composition dynamics (Belibasakis, 2018; Deshpande et al., 2018), however, the causality still remains unclear (Feres et al., 2016; LaMonte et al., 2019).

The Stomatotypes in Periodontal Health and Microbial Succession

The OM compositional patterns representing various global optimal equilibria of the microbial community have recently been referred to as "stomatotypes" (Willis et al., 2018; Willis and Gabaldón, 2020). The yet identified stomatotypes from systematically healthy individuals (De Filippis et al., 2014; Takeshita et al., 2016; Zaura et al., 2017; Willis et al., 2018) are summarized in **Table 3** together with stomatotypes identified in this study.

The comparability of the data is slightly limited by inconsistent or even missing subject characterization and examination of periodontal health before sampling.

TABLE 3 | OM stomatotypes in periodontal health.

Authors Age of No. of subjects subjects		Country Sample type		Medical/dental examination	Stomatotype designation	5		
Current study 19-53 108 Czech Republic	19-53	· · · · · · · · · · · · · · · · · · ·		All probands examinated by	Cluster 1	CT2 Streptococcus mitis/oralis HMT718, CT23, and CT24 Haemophilus spp.		
					periodontologist: no periodontal pocket >	Cluster 2	CT6 Veillonella rogosae/dispar CT25, CT27 Neisseria	MiSeq
			3mm	CT37 Gemella morbillorum Cluster 3a CT43 Streptococcus gordonii CT48 Rothia aeria				
						Cluster 3b	HMT14, CT27 <i>Neisseria</i> spp. CT33 Class Bacilli	
Willis et al. (2018)	13-15	1319	Iberian Peninsula and Balearic Islands	Saliva- mouth wash	Without dental and medical exclusion criteria	stomatotype 1 stomatotype 2	Neisseria, Haemophilus Veillonella, Prevotella, Streptococcus,	Illumina MiSeq
Zaura et al. (2017) 18-32 268 The Nethe	18-32	268	The Netherlands	Unstimulated saliva	Systemically healthy individuals, sampling during a regular check-	MIC3 MIC2	Veillonella atypica/Veillonella dispar and Prevotella Streptococcus mitis group Streptococcus gordonii Rothia mucilaginosa	Illumina MiSeq
					up at the dentist.	MIC1.3	Neisseria flavescens Neisseria subflava and Haemophilus parainfluenzae	
				MIC1.2	Streptococcus salivarius, Streptococcus vestibularis, Streptococcus australis Streptococcus parasanguinis and Granulicatella adiacens			
				MIC1.1	Prevotella sp. HMT313 and Paraprevotella/Alloprevotella sp. HMT308			
De Filippis et al. (2014) 18–55 161 Italy	5 161 Italy Unstimulated saliva Systemically healt individuals. No		taly Unstimulated saliva		cluster I cluster II	Neisseria, Fusobacterium, Porphyromonas Prevotella		
					information about dental examination.	cluster III	Streptococcus, Gemella, Porphyromonas	
Takeshita et al. (2016) >	> 40	2343	Japan	Stimulated saliva	Dental and medical examinations were	type I	Veillonella, Prevotella, Actinomyces, Rothia, S. salivarius, and S. parasanguinis	lon PGN
					performed on 68.2% individuals	type II	Streptococcus mitis, Haemophilus, Porphyromonas, Gemella, and Neisseiria	

Mutually corresponding stomatotypes are color-coded. CT stands for combined taxon (See Supplementary Table 3).

Additionally, all the other OM samples were isolated from saliva, which differs in microbial composition from subgingival plaque. Certain variability in the taxonomic composition of the identified stomatotypes can also be given by demographic differences such as the drinking water source (Willis et al., 2018) or the prevailing diet (Lassalle et al., 2018). Nevertheless, the separate clustering of *Streptococcus* and *Veillonella* based OMs was generally observed in other studies as well (Takeshita et al., 2016; Zaura et al., 2017).

Considering the current knowledge of the microbial succession in the oral cavity during the onset of periodontal disease, and the characteristics of identified genera, we could hypothesize, that only the Streptococcus-based Cluster 1 represents healthy OM, while the Cluster 2 could already represent the initial dysbiotic state. The Cluster 1 stomatotype, and also the outliers Cluster 3a and Cluster 3b, are characterized by the predominant presence of early colonizers like Streptococcus, Neisseria (Mahajan et al., 2013), Haemophilus (Kolenbrander et al., 1993), and Rothia (Sulyanto et al., 2019) involved in the initial plaque formation. Samples from the stomatotype Cluster 2 also contain early colonizers of genera Neisseria and Gemella (Mahajan et al., 2013), but most remarkably they are exceptionally rich in Veillonella species. The genus Veillonella is considered to be a pioneer colonizer as well (Sulvanto et al., 2019), but among others, it is the only highly abundant anaerobic taxon assigned generally to periodontal health. Veillonella species possess two characteristics that rank them among the most important bridging taxa in the oral biofilm community. They can utilize the lactate generated mainly by streptococci as their primary energy and carbon source, and they produce catalase protecting F. nucleatum and other more fastidious anaerobes against hydrogen peroxide (Rogosa and Bishop, 1964). Veillonella also produces nutrients for the survival and growth of periodontal pathogens (Zhou et al., 2017). Therefore, we hypothesize, that the stomatotype Cluster 2 still represents clinically healthy individuals but already with an increased risk of periodontitis development. A further stage in the disease onset and progression could be represented by Cluster 4 (the transient state) with the increased relative abundance of anaerobic CT3 F. nucleatum and CT8 Porphyromonas pasteri/catoniae but still no or a negligible amount of true periopathogens and mostly no clinical signs of the disease. F. nucleatum forms a coaggregation bridge between early aerobic colonizers and other bacteria including anaerobic members of the red complex (P. gingivalis, T. forsythia, and T. denticola) (Bradshaw et al., 1998; Mahajan et al., 2013). This ability of F. nucleatum to coaggregate with a wide variety of partner strains is highly unusual (Kolenbrander et al., 2002; Kolenbrander et al., 2006). It has been shown that fusobacteria play a role in protecting against atmospheric oxygen and hydrogen peroxide in the oral biofilm and even support the growth of anaerobes, such as Porphyromonas gingivalis, under aerated conditions (Diaz et al., 2002). The presence of F. nucleatum in a higher amount thus would enable the periodontitis-associated bacteria to overgrowth the first colonizers.

Nevertheless, it is not only the taxonomic composition of the OM but the overall metabolic activity in the oral habitat including the host response to microbial production, which are the critical factors distinguishing between oral health and dysbiosis resulting in any type of oral pathogenesis. In the majority (~ 90%) of samples, the OM taxonomic composition corresponds well to the state of health and can serve as a fast diagnostic tool, however, still, there are individuals with atypical OM taxonomic composition, the atypical metabolic activity of typical OM or unusual immune reaction toward usual OM – in all these cases, the evaluation of proteome and/or metabolome could provide a more accurate image.

DATA AVAILABILITY STATEMENT

The datasets presented in this study can be found in online repositories. The names of the repository/repositories and accession number(s) can be found below: https://www.ncbi.nlm. nih.gov/bioproject, PRJNA670573.

ETHICS STATEMENT

The studies involving human participants were reviewed and approved by Ethics Committee of the First Faculty of Medicine of Charles University and General University Hospital in Prague as a part of project No. 17-30753A of the Czech Health Research Council. The patients/participants provided their written informed consent to participate in this study.

AUTHOR CONTRIBUTIONS

JJ and LN postulated the hypothesis and designed the experiments. ML participated on experiment design, evaluated sequencing results and prepared first draft of the manuscript. JM diagnosed the patients and performed sampling. TJ assisted in sampling and performed DNA isolation and primary PCR. BT further processed samples for sequencing and participated on evaluation of sequencing results. OH did the clustering analysis and participated on evaluation of results and figure preparation. LN participated on the evaluation of results and finalized manuscript. All authors contributed to the article and approved the submitted version.

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SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fcimb.2021. 629723/full#supplementary-material

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Conflict of Interest: The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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