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A *Filifactor alocis*-centered co-occurrence group associates with periodontitis across different oral habitats

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Periodontitis is a highly prevalent polymicrobial disease worldwide, yet the synergistic pattern of the multiple oral pathogens involved is still poorly characterized. Here, saliva, supragingival and subgingival plaque samples from periodontitis patients and periodontally healthy volunteers were collected and profiled with 16S rRNA gene pyrosequencing. Different oral habitats harbored significantly different microbiota, and segregation of microbiota composition between periodontitis and health was observed as well. Two-step redundancy analysis identified twenty-one OTUs, including *Porphyromonas gingivalis, Tannerella forsythia* and *Filifactor alocis*, as potential pathogens that were significantly associated with periodontitis and supragingival plaque habitats. Interestingly, pairwise correlation analysis among the 21 OTUs revealed that *Filifactor alocis* was positively correlated with seven other putative pathogens (R > 0.6, P < 0.05), forming a co-occurrence group that was remarkably enriched in all three habitats of periodontitis patients. This bacterial cluster showed a higher diagnostic value for periodontitis than did any individual potential pathogens, especially in saliva. Thus, our study identified a potential synergistic ecological pattern involving eight co-infecting pathogens across various oral habitats, providing a new framework for understanding the etiology of periodontitis and developing new diagnoses and therapies.

Periodontitis is a polymicrobial disease of the oral cavity and a risk factor for chronic diseases such as cardiovascular disease and diabetes mellitus¹. The complex microbiota inhabiting the biofilm around teeth and gingival tissue may play a pivotal role in the development of periodontits¹⁻³. Cultivation^{4,5} and culture-independent approaches such as PCR-based assays and DNA hybridization⁶⁻⁹ have previously identified several microorganisms associated with the development of periodontitis and regarded as the putative pathogens, including *Porphyromonas gingivalis, Tannerella forsythia*, and *Treponema denticola*. More recently, the advent of high-throughput next generation sequencing techniques allowed us to characterize the overall structure of the complex oral microbial ecosystem at the OTU level, confirming the association of those potential pathogens with periodontitis and revealing additional periodontitis-associated phylotypes such as *Prevotella* spp., *Porphyromonas endodontalis, Filifactor alocis*, and *Peptostreptococcus stomatis*¹⁰⁻¹⁵.

The oral cavity is a dynamic 'continuum with the external environment'¹⁶. Though saliva, supragingival and subgingival plaque maintain unique ecosystems with distinct atmospheric and nutritional environments that favor different microbial commensals^{17–19}, the microbiota in different intraoral habitats interact with each other continuously. Dental plaque is permanently in contact with saliva. In periodontitis patients, the microbial inhabitants of saliva and supragingival plaque inoculate and colonize subgingival plaque, thus accelerating the formation of periodontal pockets, the major lesion of periodontitis. Likewise, pathogens residing in periodontal pockets spill over to the oral cavity and can be detected in saliva and supragingival plaque. Analyzing the microbiota in these environmentally distinct and yet interacting oral habitats will provide a more comprehensive understanding of the etiology and pathogenesis of periodontitis.

Polymicrobial diseases involve co-infection with multiple bacteria, which may act synergistically to contribute to disease progression and clinical outcomes²⁰. Such pathogens should be more likely to coexist at the diseased



Figure 1 | Overall structural comparison of oral microbiota. (a) Shannon diversity index of oral microbiota in different groups. Values are shown as mean \pm SEM. The different letters above the columns mean significant differences among five groups as assessed by ANOVA (P < 0.05). (b) Principal coordinate analysis (PCoA) scores plot based on weighted UniFrac metrics. Each point represents the mean principal component scores of all subjects in a group, and the error bar represents standard deviation. (c) Clustering of oral microbiota based on distances calculated using multivariate analysis of variance (MANOVA) on the first sixteen principal coordinate scores, * P < 0.05; ** P < 0.01. The abbreviations of group names are as follows: H: Periodontally healthy volunteers; P: Periodontitis patients; Sal: Saliva; Sup: Supragingival plaque; Sub: Subgingival plaque.

lesion, thus exhibiting a co-occurrence ecological pattern. For periodontal diseases, numerous bacteriologic studies clearly support the capacity of a variety of bacterial species coexisting in a complex biofilm to contribute to periodontitis^{5,6,21}. In 1998, Socransky *et al.* defined subgingival bacterial communities by checkerboard DNA-DNA hybridization and observed ecological interbacterial relationships among 32 examined species. They found that those species could be clustered into five complexes in which members showed highly similar distribution in subgingival microbiota⁶.

After that initial effort to elucidate the ecological relationships of oral microorganisms, few studies explored the inherent coexistence and distribution patterns of multiple pathogens in human oral samples in situ. Instead, recent studies have mainly focused on interactions between putative pathogens using in vitro or animal models. For instance, a rat model of periodontitis was used to study the synergistic virulence of P. gingivalis, T. denticola and T. forsythia, demonstrating that those three pathogens existed as a consortium and synergistically increased alveolar bone resorption in co-infected rats²². An in vitro flow cell biofilm model demonstrated that P. gingivalis and T. denticola exhibit a strong synergy in polymicrobial biofilm formation²³. Such studies established that *P. gingivalis* can interact synergistically with other pathogens, but not whether this pathogen actually co-exists and co-infects with the other tested pathogens in situ. Many putative pathogens have been associated with periodontitis. Whether these bacteria contribute to periodontal disease in random combinations or via specific synergistic patterns still remains a fundamental question.

Using 16S rRNA pyrosequencing, we obtained a comprehensive view of the oral bacterial communities in saliva, supragingival plaque and subgingival plaque from Chinese adults with and without periodontitis. We identified periodontitis-associated bacterial species that are commonly shared across different oral habitats, and we detected a *Filifactor alocis*-centered co-occurrence group of potential pathogens that was significantly enriched in periodontitis samples. These results laid a microbial ecological foundation for future etiological studies in periodontitis.

Results

Overall structure of oral microbiota in periodontitis and health. A total of 307,679 usable raw pyrosequencing reads passing the quality control standards were obtained from 150 samples, with an average of 2051 reads per sample (see Supplementary Fig. S1a online). After alignment in the Greengenes database and CD-hit clustering with

into 1889 OTUs at 96% similarity level (see Supplementary Fig. S1b online). The richness of oral bacterial communities in three oral habitats of periodontitis patients and the control cohort were estimated by rarefaction and Chao 1, and diversity was estimated by Shannon diversity index and Simpson diversity. The shape of the rarefaction curves indicated new phylotypes would be expected with additional sequencing. However, the Shannon diversity index curves of all samples reached plateaus with the current sequencing, suggesting that most diversity had already been captured (see Supplementary Fig. S2 online).

99.9% similarity, the unique representative sequences were classified

As revealed by the Shannon diversity index, supragingival plaque possessed the highest level of bacterial diversity, whereas saliva showed the lowest diversity. A higher level of diversity was observed in periodontitis individuals than healthy controls in both saliva and supragingival plaque (Figure 1a). The Simpson diversity index showed a similar tendency as Shannon diversity index, and the richness of the oral microbiota estimated by rarefaction and Chao 1 displayed a similar pattern (see Supplementary Table S1 online).

Principal coordinate analysis (PCoA) based on weighted UniFrac matrices revealed remarkable differentiation of the bacterial communities in the five groups, and the differences between oral habitats were more distinct than those between patients and healthy controls of the same habitats (Figure 1b). These findings were confirmed by clustering analysis based on distances calculated using multivariate analysis of variance (MANOVA) (Figure 1c).

Common and distinct taxa of oral microbiota in different oral habitats. Thirteen phyla with 143 genera were detected in the oral microbiota. *Bacteroidetes, Firmicutes, Proteobacteria, Fusobacteria, Actinobacteria* and *Spirochaetes* were the most predominant phyla when the three oral habitats were considered together, contributing to 39.1%, 23.2%, 13.4%, 11.4%, 8.3% and 2.1% of all reads, respectively.

Despite the high variability of oral microbiota among different oral habitats as revealed by PCoA, nine genera were present in all 150 oral samples. Those nine genera represented over half of the oral microbiome collectively (57.97% of all reads), constituting the predominant oral inhabitants. Among them, three genera-*Streptococcus, Leptotrichia* and *Actinomyces* accounting for 18.90% of all reads-were stable in subjects with different periodontal health status, as revealed by the similar relative abundances in saliva and supragingival plaque from periodontitis and healthy cohorts. These three genera represent the core members of the oral microbiota. The remaining six genera, including *Prevotella, Porphyromonas, Capnocytophaga, Fusobacterium*,





Figure 2 | Habitat-specific taxa detected by LEfSe. Color indicates the oral habitat in which each differential clade was most abundant.

TM7_genera_incertae_sedis and *Clostridium XIVa* displayed significantly different abundance (Mann-Whitney U test, P < 0.05) between health and periodontitis (see Supplementary Table S2 online).

At the OTU level, three OTUs were present in all 150 samples. Two of them (OTU0039 and OTU0202), which were closely related to *Streptococcus* sp. and *Leptotrichia buccalis*, showed similar relative abundance between periodontitis patients and healthy controls in saliva and supragingival plaque. The third OTU (OTU0288), which was highly homologous with *Prevotella* sp. showed different abundance between periodontitis and healthy samples (see Supplementary Table S2 online).

To identify the distinguishing taxa in human saliva, supragingival and subgingival plaque, Mann-Whitney U test and LEfSe were performed based on the RDP taxonomy data. In saliva, the most abundant phylum was *Firmicutes*, followed by *Bacteroidetes* and *Proteobacteria*. However, in both supra and subgingival plaque, the top three phyla in abundance were *Bacteroidetes*, *Firmicutes* and *Fusobacteria* (see Supplementary Table S3 online). At the genus level, as shown by a circular cladogram constructed by LEfSe, *Steptococcus*, *Neisseria*, *Veillonella*, *Rothia*, *Granulicatella*, *Haemophilus* and *Gemella* were significantly enriched in the microbiota of saliva. Several facultative anaerobic genera, including *Capnocytophaga*, *Leptotrichia* and *Corynebacterium*, were predominant in supragingival plaque. Obligate anaerobic genera including *Porphyromonas*, *Treponema*, *Tannerella*, *Fusobacterium* and *Filifactor* were more abundant in subgingival plaque (Figure 2, Supplementary Table S3). Key species-level phylotypes associated with periodontitis and two clinical parameters. To identify the species-level phylotypes of the oral microbiota associated with periodontitis, two-step redundancy analysis (RDA) was performed for saliva and supragingival plaque samples from periodontitis and healthy individuals. At the first step of RDA, health and periodontitis were used as environmental variables and the relative abundances of all OTUs in saliva or supragingival plaque were used as species variables. The Monte Carlo Permutation Procedure (MCPP) showed that the difference of microbiota between periodontitis and health in saliva or supragingival plaque was significant (P = 0.001) (Figure 3a, b). We identified 123 and 148 OTUs explaining more than 6% of the variability of the oral microbiota as key phylotypes associated with periodontitis in saliva and supragingival plaque, respectively. In the second step of RDA, two clinical parameters, pocket depth and attachment loss, were used as environment variables, and the relative abundances of OTUs selected in the first step of RDA were used as species variables (Figure 3c, d). We identified 61 and 70 OTUs as key phylotypes closely relevant to the clinical parameters in saliva and supragingival plaque, respectively. OTUs identified from those two habitats were merged into 110 OTUs all together.

Notably, 21 of the above 110 OTUs were identified in both saliva and supragingival plaque, and all 21 were enriched in periodontitis (Figure 3e, Supplementary Table S4 and S5). Eighteen of the 21 OTUs had nearest neighbors with similarity over 99% in the Human Oral Microbiome Database (HOMD), including *Porphyromonas gingiva*-



Figure 3 Key phylotypes associated with periodontitis identified by two-step RDA. Bioplot of RDA of the microbiota in saliva (a) and supragingival plaque (b) relative to periodontitis (first step of RDA). Responding OTUs that have at least 6% of the variability of the oral microbiota are indicated by blue arrows. (c-d) Bioplot of RDA of the periodontitis-associated OTUs identified in (a) and (b) relative to the combination of pocket depth (PD) and attachment loss (AL) (second step of RDA). Responding OTUs that have at least 11% and 9% of the variability of the oral microbiota in saliva and supragingival plaque respectively, are indicated by blue arrows. (e) Relative abundances of the 110 key OTUs identified by two steps of RDA (c and d). OTUs shown in green are more abundant in healthy volunteers and those in red are more abundant in periodontitis. The color of the spot corresponds to the normalized and log-transformed relative abundance of the OTU. The genus names of the OTUs are shown on the right. P, Porphyromonas; Pe, Peptostreptococcus.

P-Sal

H-Sal

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Prevotella

SD.

Neisseria sp.

Haemophilus parainfluenza

Neisseria sp

Ē. Neisseria sp.

MCPP, P=0.001

1.0

4%

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-1.0

OTUs commonly in

both two

habitats

OTUs just in

saliva

OTUs just in supragingiva plaque

-1.0

С





Figure 4 | Co-occurrence network of 21 key OTUs in the oral microbiota. Nodes represent the OTUs identified by two-step RDA, and their OTU number or nearest neighbors are displayed around the nodes. The size of the node corresponds to the log-transformed relative abundance of the OTU. Each pair of OTUs showing a Spearman's correlation coefficient value not lower than 0.5 is linked with a connecting line whose thickness corresponds to the coefficient values. Eight OTUs displaying high correlation coefficients with each other ($R \ge 0.5$) are colored with red (*F. alocis*-centered co-occurrence group), others are blue.

lis, Porphyromonas endodontalis, Tannerella forsythia, Prevotella sp., Eubacterium nodatum, Filifactor alocis, and Peptostreptococcus stomatis. The other three OTUs had lower similarities (<97%) with existing hit taxa in the database, suggesting that they are likely novel phylotypes (see Supplementary Table S4 online). Though the lonepair subgingival plaque samples of periodontitis patients were not



Figure 5 | ROC curves of the *F. alocis*-centered co-occurrence group in the identification of periodontitis based on its relative abundance in saliva or supragingival plaque. The areas under the ROC curve (AUC) of the co-occurrence group in saliva and supragingival plaque were calculated and marked in the lower right corner. The arrows point out the optimal cut-off point in the microbiota of saliva or supragingival plaque.

involved in RDA, it was found that those 21 OTUs also represented the major subgingival microbiome of periodontitis, accounting for 31.80% of the microbial community in P-Sub. Moreover, 14 of the 21 OTUs were present in two-thirds of subgingival plaque samples (see Supplementary Table S6 online), and OTU0054, an identified phylotype showing 100% similarity to *P. gingivalis*, accounted for 18.70% of the microbial community in P-Sub, constituting the most abundant phylotype in subgingival plaque.

Co-occurrence pattern of key periodontitis-associated phylotypes in the oral microbiota. Based on the 21 periodontitis-relevant species, we investigated the correlations of each pair of them. Spearman's correlation coefficients were assessed based on the normalized relative abundances of the 21 periodontitis-associated phylotypes using all 150 oral samples from the three distinct oral niches of the two cohorts. Interestingly, eight OTUs displayed high correlation coefficients with each other ($R \ge 0.5$, P < 0.05). Notably, strong positive correlation (R > 0.6, P < 0.05) was observed between OTU0263 and the remaining seven OTUs (Figure 4, Supplementary Fig. S3). Thus, OTU0263, with 100% similarity to Filifactor alocis, together with seven OTUs (OTU0054, OTU0096, OTU0204, OTU0177, OTU0223, OTU0308 and OTU0413) which were closely related to P. gingivalis, P. endodontalis, T. forsythia, E. nodatum, Fretibacterium sp., Lachnospiraceae [G-8] sp. and Peptostreptococcaceae [XI][G-4] sp., seemed to form a F. alociscentered bacterial cluster with co-occurrence relationships in the human oral cavity. This F. alocis-centered co-occurrence group collectively represented 6.28%, 5.49% and 29.11% of the oral microbiota in P-Sal, P-Sup and P-Sub, respectively.

Diagnostic value assessment of the *F. alocis*-centered co-occurrence group. To assess its performance in identifying the risk of periodontitis, the relative abundances of the *F. alocis*-centered co-occurrence group and the 21 individual key phylotypes were used to construct receiver

operating characteristic (ROC) curves in which test sensitivity is plotted against 1-specificity or false positive rate (FPR), to evaluate the performance of diagnostic tests. Area under the ROC curve, cut-off point, sensitivity, specificity, likelihood ratio and P values were calculated and compared. In saliva, the area under the ROC curve of the co-occurrence group was the highest of all the tested phylotypes (0.817), implying that this cluster has the highest value for periodontitis diagnosis (Figure 5, Supplementary Table S7). The cut-off points of the abundances of this group were determined at 2.11% in saliva (Chi-square test, P < 0.001, sensitivity 0.87, specificity 0.73, likelihood 23.8) and 1.58% in supragingival plaque (Chi-square test, P < 0.001, sensitivity 0.77, specificity 0.63, likelihood 10.1), indicating that a person who has the abundance of this cluster over 2.11% in saliva or over 1.58% in supragingival plaque would have a high risk of periodontitis.

Discussion

For decades, efforts have been made to identify potential pathogens and elucidate their functions in the development of periodontitis. However, given the complexity of the oral microbiota, there is still no definitive evidence demonstrating how many different pathogens are involved in the polymicrobial disease and how these co-infecting species interact with each other in triggering the disease and contributing to its progression.

In this investigation, saliva, supragingival plaque and subgingival plaque samples were used to characterize the oral microbiota. *Streptococcus, Leptotrichia* and *Actinomyces* were commonly detected in all 150 samples with similar abundance in health and periodontitis. Such taxa are regarded as components of the core oral microbiota that adapt to the oral environment and provide structural support for the oral microbiota¹¹. These three genera have been identified as the core members or major genera with the largest representation in the oral microbiome in previous studies^{2,24,25}.

We also found that each oral habitat harbored its distinct microbiome. In saliva, several genera including *Steptococcus, Neisseria, Veillonella, Rothia, Granulicatella, Haemophilus* and *Gemella* were predominant, which were previously reported as commensal bacteria colonizing the mucosal surfaces of mouth^{17,26}. Supragingival plaque exhibited the highest level of microbial diversity, dominated by three facultative anaerobic genera including *Capnocytophaga, Leptotrichia* and *Corynebacterium*. In subgingival plaque, obligate anaerobic bacteria such as *Porphyromonas, Treponema, Tannerella, Fusobacterium* and *Filifactor* were found as major members of this anaerobic niche. Thus, the different microbial distribution in diverse oral habitats may be mainly driven by the surface structure and oxygen condition of each microhabitat²⁷.

Via a microbiome-wide association study (MiWAS) strategy, 21 OTUs were found to be associated with periodontitis. MiWAS strategy combines high-throughput DNA-sequencing technology with multivariate statistical tools such as principal component analysis (PCA), principal coordinate analysis (PCA) and redundancy analysis (RDA), to explore the structural variations across the entire human microbiome without any prior hypothesis, aiming to identify all relevant bacteria associated with diseases^{28,29}. Here, using pyrosequencing data from the bacterial 16S rRNA gene V3 region, 21 periodontitis-enriched OTUs were detected through a two-step RDA in both saliva and supragingival plaque. In subgingival plaque, these 21 OTUs collectively represented about one-third of the microbiota and contained the most abundant phylotype (OTU0054) of this habitat. Hence, these 21 OTUs were closely linked to periodontitis and could be considered as potential pathogens.

Despite the difficulty of assigning an OTU to an exact species due to the short sequencing read lengths, OTU0054, OTU0204 and OTU0263 were found to be closely related to the putative periodontopathic bacteria *P. gingivalis*, *T. forsythia* and *F. alocis*, and were present in 93.3%, 90.0% and 92.2% of oral samples from periodontitis patients, respectively. These three OTUs accounted for 65.7% of the total abundance of the 21 OTUs in the three habitats of periodontitis patients. *P. gingivalis*, *T. forsythia* and *F. alocis* were frequently found to link with periodontitis in previous studies using subgingival plaque samples^{7,9–11,30} or saliva samples^{31,32}. Among those three bacteria, *P. gingivalis* was the most widely studied periodontal pathogen, partially due to its high detection rate via culture methods^{4,5}. This bacterium shows numerous virulence factor activities, such as gingipain proteases, lipopolysaccharides and fimbriae³³, allowing it to invade and survive within gingival epithelial cells. It was reported that even at low colonization levels (< 0.01% of the total microbiota), *P. gingivalis* could change the amount and the composition of the oral microbial symbionts, triggering inflammatory periodontal bone loss in a mouse model³⁴.

In addition, we identified 18 other OTUs significantly associated with this disease, including OTUs that were closely related to P. endodontalis (OTU0096), E. nodatum (OTU0177), Peptostreptococcus spp. (OTU0115, OTU0413 and OTU0312), Prevotella spp. (OTU0200, OTU0290 and OTU0211), Lachnospiraceae [G-8] sp. (OTU0308), Bacteroidetes [G-3] sp. (OTU0304), Fretibacterium sp. (OTU0223), Johnsonella sp. (OTU0287), Leptotrichiaceae [G-1] sp. (OTU0146) and Mollicutes [G-2] sp. (OTU0309). These 14 phylotypes were previously reported to be associated with periodontitis in investigations based only on subgingival plaque samples⁹⁻¹¹, while they were detected in all three oral habitats in this study. We also observed that one OTU (OTU0089), which increased its abundance in periodontitis, is closely related to Actinomyces cardiffensis, a Gram-positive facultative anaerobic rod. This bacterium can be isolated from diverse human clinical sources such as pleural fluid, brain, jaw, pericolic and ear abscesses³⁵, and was reported to be involved in human infection cases such as pulmonary and hepatic actinomycosis^{36,37}, but its linkage with periodontitis has not previously been reported in the literature. We suspected that its capability of forming abscesses in diseased lesions might contribute to the invasion of itself or other pathogens into the periodontal tissues, promoting the progression of periodontitis. Finally, we found three OTUs (OTU0456, OTU0198 and OTU0463) with no known nearest neighbor that were significantly enriched in periodontitis. These three newly identified phylotypes represent 1.27% of the total abundance of the 21 OTUs in all samples of patients. Our results reinforce the polymicrobial nature of periodontitis as a disease related to a dysbiotic microbiota, with dozens of microbes implicated.

For a polymicrobial disease, identification of potential pathogens is only the first step; delineating the species-species interactions of multiple pathogens is essential for understanding the microbial etiology of the disease. In the present study, we examined the pairwise correlation coefficient among the 21 potential periodontal pathogens identified, according to their abundance in all 150 oral samples from three distinct oral niches of the two human cohorts. A bacterial group composed of eight phylotypes showed a robust co-occurrence pattern. Their abundance varied among different oral samples with the same tendency, increasing together in three habitats of periodontitis patients and decreasing together in two habitats of healthy individuals. Our finding implied there might be synergistic interactions among them, which should be confirmed by further *in vitro* or animal experiments.

The synergistic interactions between some cultivable indigenous oral pathogens have been revealed previously by *in vitro* studies. Grenier demonstrated that *P. gingivalis* can produce isobutyric acid to stimulate the growth of *T. denticola* and metabolize the succinate produced by *T. denticola* to promote its own growth³⁸. *F. nucleatum* can maintain a more neutral pH in the microenvironment to protect acid-sensitive species such as *P. gingivalis* against acid attack³⁹ or generate a necessary reductive and capnophilic microenvironment for the growth of *P. gingivalis*⁴⁰. The ability of *P. gingivalis* to invade human gingival epithelial cell was enhanced when co-cultured with *F. nucleatum*⁴¹. However, these studies focused only on interactions between two arbitrarily selected potential pathogens. It is not clear

Table 1 Background characteristics of all individuals		
	Periodontitis patients	Periodontally healthy volunteers
N	30	30
Gender (Males/Females)	15/15	9/21
Age, years	29–67	21–55
Pocket depth (mean ± SD, mm)	4.80 ± 0.96	2.13 ± 0.41
Attachment loss (mean ± SD, mm)	4.30 ± 1.43	0.10 ± 0.31
Sampling habitats	Saliva, Supragingival plaque, Subgingival plaque	Saliva, Supragingival plaque

whether these selected pathogens actually co-occur in the same niche in disease. The co-occurrence pattern found in our study indicates that it is necessary to look at interactions among pathogens that occur in the same habitat to evaluate relevance to disease progression. It is also necessary to study interactions among more than two potential pathogens.

In the co-occurrence pattern we identified, a phylotype closely related to F. alocis showed strong positive correlations with seven other members (R > 0.6 for each pair), thus seemed to be the center of this bacteria cluster. F. alocis is a Gram-positive obligate anaerobic rod, which was recently identified as one of the marker organisms for periodontal diseases using culture-independent approaches, due to its higher prevalence and abundance in periodontal disease sites compared with healthy sites^{7,10,42,43}. This organism was even found to rank higher in its prevalence than previously identified periodontal pathogens, including P. gingivalis⁴⁴. F. alocis is relatively resistant to oxidative stress and possesses several virulence factors, such as sialoglycoproteases and proteases, which may partially contribute to its colonization and survival in the periodontal pocket. In addition, in vitro experiments showed that F. alocis could induce apoptosis in gingival epithelial cells (GECs) and stimulate proinflammatory cytokines such as IL-1 β , IL-6 and TNF- α secreted by GECs⁴⁵, supporting the notion that *F. alocis* may be an important pathogen in the formation of subgingival biofilm and the onset of periodontal diseases. Previous studies also showed that F. alocis could synergistically interact with other periodontal pathogens in vitro. For example, F. alocis could enhance the biofilm formation and the invasion of epithelial cells by *P. gingivalis* during coculture⁴⁴. F. alocis was also found accumulated around F. nucleatum-abundant regions and showed mutualistic growth with F. nucleatum in an in vitro community development model⁴⁶. Given the co-occurrence pattern we found, F. alocis may similarly enhance the growth or virulence of other pathogens in the co-occurrence group, promoting the development of periodontitis.

The remaining seven members of the co-occurrence group include P. gingivalis, P. endodontalis, T. forsythia, E. nodatum, Fretibacterium sp., Lachnospiraceae [G-8] sp. and Peptostreptococcaceae [XI][G-4] sp. Each of these bacteria has been previously identified as associated with periodontitis in different studies by culture or culture-independent approaches^{5,9,11,47,48}. Though they are not novel pathogens for periodontitis, their coordinated occurrence is novel. P. gingivalis and T. forsythia were the only two microorganisms which were reported to be synergistic in previous studies. For example, in vitro experiment showed that P. gingivalis or its outer membrane vesicles could enhance the attachment and invasion of T. forsythia to epithelial cells⁴⁹. Yoneda et al. also reported that the co-infection of P. gingivalis and T. forsythia induced greater abscess size than did mono-infection of each bacterium in a murine model⁵⁰. There are no relevant reports about interactions among the remaining members of the co-occurrence group. It is possible that some of them produce metabolites that directly affect the growth of others (metabolite crossfeeding) or that modify the local microenvironment to favor the growth or virulence of other organisms⁵¹. The inherent relationship between these multiple potential pathogens in the oral microbiota merits further study.

The F. alocis-centered co-occurrence group potentially has a high diagnostic value for periodontitis, especially in saliva where the cluster showed the largest area under the ROC curve and high sensitivity and specificity to discriminate periodontitis from healthy samples (cut-off point 2.11%, P < 0.001, sensitivity 0.87, specificity 0.73, likelihood 23.8). Saliva is an abundant oral biofluid that can be collected noninvasively. Previous reports have revealed that oral bacteria such as A. actinomycetemcomitans, C. rectus, P. gingivalis, P. intermedia, P. nigrescens, P. micros, T. denticola, T. forsythia, F. nucleatum and T. socranskii are detectable and enriched in saliva from periodontitis patients, and therefore could be useful salivary biomarkers of periodontitis^{31,52}. We demonstrate in this study that the diagnostic value of the F. alocis-centered co-occurrence group was higher than any single periodontitis-related phylotype in saliva, reinforcing the significant role of this group in periodontitis progression and providing a potential indicator to identify high-risk periodontitis patients.

In summary, we characterized the microbiota of three main oral habitats in human subjects with and without periodontitis. Saliva, supragingival plaque and subgingival plaque harbor *Streptococcus*, *Leptotrichia* and *Actinomyces* as a common core oral microbiota, and each habitat also harbors its distinct microbial members. Twenty-one species-level OTUs were identified as periodontitis-associated phylotypes, including a *F. alocis*-centered co-occurrence group consisting of eight phylotypes that were positively correlated with each other in various habitats of the oral cavity. The co-occurrence pattern of those potential pathogens underlines their ecological relationship relevant to disease progression. The findings from this study may serve as an ecological framework to facilitate not only the understanding of the complex etiology of periodontitis, but also the development of a new periodontal diagnoses and therapies targeting this co-occurrence group.

Methods

Study subjects. A total of 30 periodontitis patients, aged 29-67 years, were recruited from the department of periodontology in Ninth People's Hospital (Shanghai, China). These patients took no periodontal treatment in the 3 months before sample collection. Thirty periodontally healthy volunteers, aged 21-55 years, were selected as controls. Inclusion criteria for all participants included no pregnancy or any systemic diseases, no antibiotic therapy within the past 3 months, and at least 20 teeth in the oral cavity excluding third molars. Every periodontitis patient had, in each quadrant, at least one posterior tooth with pocket depth \geq 4 mm and attachment loss \geq 2 mm, whereas healthy controls exhibited no site with pocket depth >3 mm or attachment loss ≥2 mm and displayed no clinical gingival inflammation (no more than 10% of the sites with bleeding on probing and absence of gingival redness/edema). The baseline clinical characteristics of all individuals are showed in Table 1. Written informed consent was obtained from all the participants. This study was approved by the Ethics Committee of Shanghai Ninth People's Hospital affiliated to Shanghai Jiao Tong University, School of Medicine, China (Document No. 201262), and all experiments were performed in accordance with the relevant guidelines and regulations.

Sample collection. All the participants were instructed to refrain from eating, drinking and any oral hygiene practice for at least 3 h before sampling. After rinsing mouth with water, approximately 1 ml non-stimulated saliva was collected and transferred into 1.5 ml sterile centrifuge tubes. The selected teeth (four teeth with the highest level of pocket depth from four quadrants) were then isolated using cotton rolls and gentle air-drying. Supragingival plaque was collected first, followed by subgingival plaque from the bottom of the periodontal pocket of the same teeth using sterile subgingival curettes. The pooled supragingival plaque and the pooled

subgingival plaque from each subject were separately stored in 1.5 ml sterile centrifuge tubes containing 1 ml sterile phosphate-buffered saline (PBS). All samples were immediately frozen at -80° C until DNA extraction. In total, 150 samples were collected and divided into five groups according to the sampling habitats and populations: H-Sal (saliva samples collected from healthy controls, n = 30), H-Sup (supragingival plaque samples collected from healthy controls, n = 30), P-Sal (saliva samples collected from healthy controls, n = 30), P-Sal (saliva samples collected from periodontitis patients, n = 30), P-Sup (supragingival plaque samples collected from periodontitis patients, n = 30), Subgingival plaque samples collected from periodontitis patients, n = 30). Subgingival plaque samples were not collected from healthy controls because there is no distinct periodontal pocket formed in healthy gingival tissue.

DNA extraction and pyrosequencing. Oral samples were washed twice with PBS and underwent two cycles of freeze-thawing at -80° C for 10 min and 60° C for 2 min. Genomic DNA was then extracted from each oral sample using bead-beating extraction and phenol-chloroform purification, as described previously^{28,53}. The extracted DNA was used as a template for PCR amplification. The bacterial universal primer pair⁵⁴ consisting of the forward primer 5'-NNNNNNNN<u>CCTACGGGAGG-</u> CAGCAG-3' and the reverse primer 5'-NNNNNNNNATTACCGCGGGCTGCT-3', marked at the 5' end with a sample-unique 8-base barcode, was used to amplify the V3 region of 16S ribosomal RNA gene from each oral sample. PCR amplification, pyrosequencing of the PCR amplicons, and quality control of raw data were performed as described previously⁵⁵. Briefly, we performed the following steps to select the high quality reads for bioinformatics analysis: 1) Search for the primers by using blast-based matching (Word size = 4, E-value = 0.1); the primer at least at the sequencing end should exist. 2) Locate the barcodes according to the position of the primers; reads should have at least one complete barcode; reads with incomplete barcodes at both ends, or with complete but poorly-matched barcode pairs (more than one insertion/deletion/mismatch) were discarded. 3) Reads were assigned to the corresponding sample using the complete barcode. If the barcodes were complete at both ends but mismatched with each other, we took the barcode at the sequencing end. 4) After trimming the primer and barcode bases, those sequences with a variable region more than 100nt and less than 300nt in length and with no more than two undetermined bases were preserved.

Bioinformatics and multivariate statistics. All high-quality pyrosequencing reads were aligned against the Greengenes database using the nearest alignment space termination (NAST) algorithm⁵⁶ with template length \geq 90 bases and percent identity \geq 75%. After that, the remaining sequences were clustered using CD-hit with 99.9% similarity⁵⁷. The most abundant sequence of each cluster was selected as the representative sequence and subjected to online RDP classifier (Version 2.6) for taxonomical assignment with a bootstrap cutoff of 50% (http://rdp.cme.msu.edu/ classifier/classifier.jsp). The data of RDP taxonomy was used in LEfSe to discover the taxa differentiating the microbial communities specific to different oral habitats⁵⁸. Briefly, saliva, supragingival plaque and subgingival plaque were used as three classes and divided into two subclasses according to the sampling populations (periodontitis/ health). After factorial Kruskal-Wallis test among classes and subsequent pairwise Wilcoxon test between subclasses at the same population with a significance alpha of 0.01 and an effect size threshold of 2, the taxa, which showed highest level of abundances in one oral habitat, were selected.

Meanwhile, those representative sequences after CD-hit were imported into the ARB to construct a neighbor-joining tree. Operational taxonomic unit (OTU) was delineated at 96% similarity level with DOTUR59. Rarefaction analysis (aRarefactWin software, S Holland, Stratigraphy Laboratory, University of Georgia, Athens, GA, USA, http://www.uga.edu/strata/software), Shannon diversity index (H') (R package 2.12.0), as well as Simpson's diversity index (1-D) and Chao1 estimate were calculated (QIIME). The most abundant sequence of each OTU was selected, imported into the ARB and inserted into a pre-established phylogenetic tree of the full-length 16S rRNA gene sequences to generate a phylogenetic tree. The phylogenetic tree, together with sequence abundance data, was then used for online Fast UniFrac analysis based on a weighted metric (http://unifrac.colorado.edu/). The most abundant sequence of each OTU was BLAST searched against the Human Oral Microbiome Database (HOMD) to find out the nearest neighbor of the OTU (http://www.homd.org/modules. php?op=modload&name=RNAblast&file=index&link=upload). Relative abundances of OTUs were used for correlation analysis via Matlab R2010a (The MathWorks, Inc., USA). Redundancy analysis (RDA) was performed using CANOCO for Windows 4.5 (Microcomputer Power, USA). ROC curves were constructed to determine the diagnostic values for periodontitis of key periodontitisassociated phylotypes or co-occurrence group via SPSS Statistics 21 (IBM, USA). The area under the ROC curve is the most commonly used index to evaluate the diagnostic accuracy, with values close to 1.0 indicating high diagnostic accuracy. The points displaying the largest Youden's index (sensitivity + specificity - 1) were defined as the optimal cut-off points.

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Author contributions

Conceived and designed the experiments: X.P., Z.T. and L.Z. Performed the experiments: H.C. Analyzed the data: H.C. Contributed reagents/materials/analysis tools: Z.T., Y.L., Z.Q., M.Z. and G.W. Wrote the paper: H.C. and X.P. Revised the manuscript: X.P., L.Z. and L.B.

Additional information

These sequence data have been uploaded to the Sequence Read Archive database under the accession number SRP050141.

Supplementary information accompanies this paper at http://www.nature.com/ scientificreports

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