



Published in final edited form as:

Nat Microbiol. 2023 December ; 8(12): 2315–2325. doi:10.1038/s41564-023-01527-3.

Ancient dental calculus reveals oral microbiome shifts associated with lifestyle and disease in Great Britain

Abigail S. Gancz^{1,17}, Andrew G. Farrer^{2,17}, Michelle P. Nixon³, Sterling Wright¹, Luis Arriola², Christina Adler^{4,5}, Emily R. Davenport^{6,7,8}, Neville Gully⁹, Alan Cooper^{2,10}, Kate Britton¹¹, Keith Dobney^{11,12,13,14}, Justin D. Silverman^{3,8,15,16}, Laura S. Weyrich^{1,2,7}

¹Department of Anthropology, The Pennsylvania State University, State College, PA, USA.

²School of Biological Sciences, University of Adelaide, Adelaide, South Australia, Australia.

³College of Information Sciences and Technology, The Pennsylvania State University, State College, PA, USA.

⁴School of Medical Sciences, Faculty of Medicine and Health, The University of Sydney, Sydney, New South Wales, Australia.

⁵Charles Perkins Centre, The University of Sydney, Sydney, New South Wales, Australia.

⁶Department of Biology, The Pennsylvania State University, State College, PA, USA.

⁷Huck Institutes of the Life Sciences, The Pennsylvania State University, State College, PA, USA.

⁸Institute for Computational and Data Sciences, The Pennsylvania State University, State College, PA, USA.

⁹School of Dentistry, Faculty of Health Sciences, University of Adelaide, Adelaide, South Australia, Australia.

¹⁰Gulbali Institute, Charles Sturt University, Albury, New South Wales, Australia.

¹¹Department of Archaeology, School of Geosciences, University of Aberdeen, Aberdeen, UK.

¹²Department of Archaeology, Faculty of Arts and Social Sciences, University of Sydney, Sydney, New South Wales, Australia.

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Correspondence and requests for materials should be addressed to Laura S. Weyrich., lsw132@psu.edu.

Author contributions

A.G.F., N.G., A.C., K.D. and L.S.W. conceived of the study and developed the experimental design. A.C., A.G.F., C.A., K.B., K.D. and L.S.W. worked on sample acquisition. A.G.F. completed the laboratory analysis. A.S.G., A.G.F., S.W. and L.A. completed the bioinformatics and computational analysis. A.S.G., M.P.N., E.R.D., J.D.S. and L.S.W. performed the statistical analysis. A.S.G., A.G.F. and L.S.W. wrote the paper, and all authors edited and commented on the paper.

Code availability

The analysis pipelines are available in the microARCH GitHub page (@microARCHlab/BritishDentalCalculus_2021), as well as in <https://github.com/michellepistner/ancientDNA>.

Competing interests

The authors declare no competing interests.

Additional information

Supplementary information The online version contains supplementary material available at <https://doi.org/10.1038/s41564-023-01527-3>.

¹³Department of Archaeology, Classics and Egyptology, School of Histories, Languages and Cultures, University of Liverpool, Liverpool, UK.

¹⁴Department of Archaeology, Faculty of Environment, Simon Fraser University, Burnaby, British Columbia, Canada.

¹⁵Department of Statistics, The Pennsylvania State University, State College, PA, USA.

¹⁶Department of Medicine, The Pennsylvania State University, Hershey, PA, USA.

¹⁷These authors contributed equally: Abigail S. Gancz, Andrew G. Farrer.

Abstract

The prevalence of chronic, non-communicable diseases has risen sharply in recent decades, especially in industrialized countries. While several studies implicate the microbiome in this trend, few have examined the evolutionary history of industrialized microbiomes. Here we sampled 235 ancient dental calculus samples from individuals living in Great Britain (~2200 BCE to 1853 CE), including 127 well-contextualized London adults. We reconstructed their microbial history spanning the transition to industrialization. After controlling for oral geography and technical biases, we identified multiple oral microbial communities that coexisted in Britain for millennia, including a community associated with *Methanobrevibacter*, an anaerobic Archaea not commonly prevalent in the oral microbiome of modern industrialized societies. Calculus analysis suggests that oral hygiene contributed to oral microbiome composition, while microbial functions reflected past differences in diet, specifically in dairy and carbohydrate consumption. In London samples, *Methanobrevibacter*-associated microbial communities are linked with skeletal markers of systemic diseases (for example, periostitis and joint pathologies), and their disappearance is consistent with temporal shifts, including the arrival of the Second Plague Pandemic. This suggests pre-industrialized microbiomes were more diverse than previously recognized, enhancing our understanding of chronic, non-communicable disease origins in industrialized populations.

Modern, industrialized microbiomes are linked to a wide range of non-communicable, chronic diseases, including obesity, cardiovascular disease, allergies and poor mental health^{1,2}, which are increasing rapidly in industrialized countries and are predicted to rise in low- and middle-income countries in the future^{3,4}. As such, determining the evolutionary background of these microbial communities is critical to understanding the origins and aetiologies of these diseases. To date, the origins and evolution of industrialized microbiomes are primarily investigated by examining ‘pre-industrialized’ microbiomes of other primates or extant Indigenous peoples who practise traditional subsistence lifeways (such as hunting and foraging)^{5–9}. Such research has suggested that shifts in diet (for example, reductions in dietary fibre⁸) and the loss of microorganisms (for example, *Helicobacter pylori*) have shaped industrialized gut microbiomes⁵, alongside changes in environmental and social factors¹⁰. Studies tracking gut microbiomes of immigrants to industrialized countries, such as the United States of America, have similarly shown a decrease in diversity and a loss of certain species upon the adoption of ‘Western’ lifestyles^{11,12}, confirming that industrialization has substantial impacts on the human gut microbiome. As a response, scientists have called for the biobanking of Indigenous people’s microorganisms before those microorganisms become extinct¹³.

Despite these findings, the extent and rate of microbial extirpations in industrialized societies remain poorly understood, as the approaches used to describe pre-industrialized microbiota are problematic. First, each population has a unique evolutionary history with distinct genetics, environments, diets and selection pressures that shape its microbiome in unique ways¹⁴. Consequently, modern non-industrialized populations or immigrants may not accurately reflect the microorganisms that existed in the ancestors of industrialized peoples today^{15,16}. Second, this research places unnecessary responsibilities and obligations on Indigenous communities to participate in microbiome research, the benefits of which may not directly serve Indigenous peoples¹⁷. Therefore, a more direct path towards reconstructing pre-industrialized human microbiomes is needed. One such approach is to use the available bioarchaeological record of communities that predate industrialized populations through the analysis of ancestral archaeological human remains. Although this approach involves a number of complex challenges in recovering gut microbiomes^{18,19}, reconstructing ancient oral microbiomes preserved within calcified dental plaque (called calculus) is an established way of tracing past oral microbial histories^{20,21}.

Results

Filtering and authentication of British oral microbiomes

We performed an ancient dental calculus study ($n = 235$ samples assessed), reconstructing authenticated oral microbiota using shotgun metagenomics from 183 pre-industrialized individuals who were excavated across 27 archaeological sites in England and Scotland (Fig. 1 and Supplementary Table 1) from ~2200 bce to 1853 ce, to directly describe the history of a pre-industrialized population's microbiome. These samples originate from eight geographic regions and include individuals who resided in Britain before Roman colonization and up to the 'Industrial Revolution' (Supplementary Section 1 and Supplementary Table 1). We used a multi-tiered assessment procedure to authenticate and control for contamination in this dataset (Supplementary Section 3, Supplementary Fig. 3 (summary) and Supplementary Tables 2–5 and 13). First, we included only high-quality samples with more than 100,000 taxonomically assigned sequences²² and more than 5 phyla²⁰. We authenticated ancient DNA fragmentation with a novel, reference-free DNA damage program called ChangePoint²³ (Supplementary Table 5) and the gold-standard, reference-based approach called MapDamage2.0 (ref. 24); damage consistent with these archaeological ages was present in known oral species (*Streptococcus sanguinis*, *Porphyromonas gingivalis*, *Actinomyces* oral taxon 414, Anaerolineaceae bacterium oral taxon 439 and *Methanobrevibacter oralis*) and less in common contaminant species (*Burkholderia multivorans*, *Comamonas testosteroni*, *Escherichia coli* and Flavobacteriaceae bacterium; Supplementary Table 13). We were conservative and limited the effects of potential laboratory and environmental contaminant DNA by removing samples whose microbial composition was similar to that of laboratory controls (Supplementary Fig. 2 and Supplementary Table 2) and conservatively filtering contaminant species identified in environmental and laboratory controls (Supplementary Fig. 4 and Supplementary Table 4). Lastly, we verified the presence of oral taxa from known modern and ancient oral microbiomes using SourceTracker1.0 (MALTx results) and SourceTracker2.0 (MALTn results; average 85% oral; Supplementary Section 3 and Supplementary Figs. 2 and 13)

and confirmed that the highly abundant taxa were present in the Human Oral Microbiome Database (Supplementary Fig. 13c).

Oral geography biases significantly impact ancient oral microbiome data

As oral geography (that is, position within the oral cavity) plays a role in oral microbiome composition^{25–28}, we tested and identified oral geography biases in the dataset; calculus sample size and gingival location influenced taxonomic composition in molars, while tooth surface drove compositional variation in incisors (Fig. 2a–c and Supplementary Section 4). As a result, we stratified our taxonomic and functional data according to tooth type and included oral geography (that is, tooth type, surface, gingival region and calculus size) in our statistical analyses (Supplementary Tables 6–9). As these biases probably reflect biological and ecological differences in the mouth²⁵, these differences attributed to oral geography raise questions about the interpretations of previous palaeomicrobiome studies that used calculus samples collected from a mixed dentition^{29–31} and suggest that future studies should control for oral geography during sampling and analysis (Supplementary Fig. 18). Overall, 954 microbial species were identified across all ancient British calculus samples, predominantly spanning the Firmicutes, Actinobacteria, Proteobacteria and Bacteroidetes phyla (Supplementary Fig. 4).

British oral microbiome composition is driven by two major community types

To explore drivers of variation in pre-industrialized oral microbiome composition, we performed a principal coordinate analysis (PCoA) ordination of Bray–Curtis dissimilarities with biplots (Fig. 3a and Supplementary Fig. 5a) using microbial genera identified in the samples. We observed a ‘U’-shaped curve indicative of distinct ecologies³² (axis 1 = 41.25% variation; Fig. 3a and Supplementary Table 10), and the biplots indicated that the *Methanobrevibacter* and *Streptococcus* genera were associated with the 41.2% of the variation explained by axis 1, while *Actinomyces*-dominated communities drove variation on axis 2 (13.8%, Fig. 3a). As such, we grouped the samples according to whether or not the *Methanobrevibacter*, *Streptococcus* and *Actinomyces* genera were most dominant in each sample. We then compared the two communities on the extremes of axis 1 (that is, *Streptococcus* and *Methanobrevibacter* associated) to assess major factors that drive oral microbial diversity (Fig. 3a). *Streptococcus*- and *Methanobrevibacter*-associated samples contained distinct community assemblages (dominant category; R^2 0.20, P 0.05; Supplementary Table 12). Co-occurrence analysis of the *Streptococcus*- or *Methanobrevibacter*-associated communities using CCLasso positively associated *Streptococcus* with the *Leptotrichia*, *Neisseria*, *Gemella*, *Capnocytophaga*, *Granulicatella*, *Lautropia*, *Kingella*, *Aggregatibacter*, *Lachnoanaerobaculum* and *Rothia* genera (Fig. 3b,c and Supplementary Table 11), as seen in modern industrialized oral microbiomes, such as those from Spain (Supplementary Fig. 6). In contrast, *Methanobrevibacter* positively co-occurred with genera not often described in the industrialized oral cavity, including *Methanosphaera*, *Peptoniphilus*, *Anaerofustis*, *Syntrophomonas*, *Shuttleworthia*, *Subdoligranulum*, *Pseudoramibacter*, *Synergistes*, *Hungatella* and *Butyrivibrio* taxa (Fig. 3b,c and Supplementary Table 11). Several different oral *Methanobrevibacter* species have now been described in ancient mouths³³, and at least three of the co-occurring genera have been previously characterized in the mouth^{34–36} and not as contaminants^{20,26,30}.

We confirmed via a literature review that species within these co-occurring genera can cohabitate with *Methanobrevibacter* oral species, as all are anaerobic and can produce metabolic by-products that support methanogenesis³⁷. However, this *Methanobrevibacter*-associated community has not yet been described in studies of modern dental calculus^{20,31,38}, suggesting that a *Methanobrevibacter*-associated community may represent a unique oral microbial ecology not typically found in modern industrialized societies.

To explore the origins of these two microbial communities, we tested whether physiological, cultural and temporal factors previously thought to drive ancient oral microbiome composition were associated with this signal in ancient British microbiomes³⁹. Demographic variables (that is, sex and age), broad cultural classifications (that is, religion, class, or urban and rural locations; Supplementary Table 1) or major biocultural or socio-political events (for example, civil war or plague outbreaks, such as the Second Plague Pandemic, also known as the Black Death (caused by *Yersinia pestis*); Supplementary Table 1) did not explain significant levels of taxonomic or functional compositional variation across Great Britain (ADONIS, $P > 0.05$; Supplementary Table 12). A mild association between the location where individuals were buried (that is, cemetery) and microbial genera composition was observed (ADONIS, $R^2 = 0.158$, $P = 0.031$; Supplementary Table 12), but this was not true when examining the data at the species level (ADONIS of contaminant species-filtered data, $P > 0.05$; Supplementary Table 12). Unexpectedly, these findings suggest that these large-scale cultural and social factors that occurred across Britain over 2,200 years were not significant drivers of oral microbiome composition at a population scale in this dataset.

Ancient British oral microbiomes are potentially linked to oral hygiene

We next examined whether these microbial communities were linked to known signatures of oral disease, as *Methanobrevibacter* taxa have been linked to severe periodontitis in modern populations⁴⁰. As indicated by an ADONIS test ($P > 0.05$), oral microbiome composition in all individuals was not linked to the occurrence of periodontal disease, nor other known oral pathologies, such as caries or apical abscesses (Supplementary Table 12). Unexpectedly, species and functions linked to periodontal disease in modern populations (for example, *P. gingivalis* and *Tannerella forsythia*) were more likely to be found in *Streptococcus*-associated communities than those dominated by *Methanobrevibacter* (Supplementary Table 13), suggesting that the modern aetiology of industrial-age periodontal disease may in fact originate from the *Streptococcus*-associated communities. However, oral microbiome composition was directly linked with size of the calculus sample analysed (Fig. 2b and Supplementary Tables 6–9). While it would be reasonable to infer that *Methanobrevibacter*-associated communities may thrive within larger, potentially more mature calculus deposits, consistent with the anaerobic requirements of these taxa, we did not find this to be the case. The separation of samples into *Streptococcus*- or *Methanobrevibacter*-associated communities did not explain calculus sample size (ADONIS; $P = 0.101$), nor was the size of calculus samples driven by *Methanobrevibacter*-associated species. Rather, taxa associated with *Streptococcus* communities (based on the correspondence analysis in Supplementary Table 11), including *Gemella* and *Lautropia*, were associated with larger sample sizes (ALDEx2; Supplementary Fig. 17). Nevertheless, modern oral hygiene practices can reduce

dental plaque and calculus formation^{41,42} and lead to smaller deposits, so it is possible that compositional shifts in ancient British communities are linked to dental hygiene practices.

Oral microbial functions can be used to reconstruct past diets

As dietary changes are proposed to be a main driver of oral microbiome evolution through time^{20,30,39}, we further explored whether differences in diet could underpin these two distinct microbial ecologies. Direct dietary DNA signals were explored in six deeply sequenced calculus samples (that is, >100 million sequences per sample; 3 samples each from *Streptococcus*-associated or *Methanobrevibacter*-associated communities), but after careful consideration^{43,44}, no verifiable DNA fragments could be robustly confirmed from either plants or non-host animals. As oral microorganisms in dental plaque can ferment sugars, starch molecules and amino acids in the mouth⁴⁵, we then developed a novel approach to explore whether indirect dietary signals were present. We assembled a list of microbial genetic functional differences linked to dietary changes in the gut^{8,20,46,47}, as a proxy for predicting broad dietary differences. We included 42 amino acid metabolism functions linked to either carnivorous or herbivorous diets⁴⁶, 17 functions linked to high- or low-dietary-fibre digestion⁸, 124 carbohydrate metabolism gene families, and 30 lactose and galactose metabolism functions linked to milk consumption (Supplementary Table 14). We first validated this approach by examining the presence of these microbial functions in calculus from a modern, industrialized Spanish population (Supplementary Table 1). Our results were consistent with an omnivorous diet with high sugar (for example, lactate fermentation, fructose utilization, galactose degradation and glucose utilization) and low dietary-fibre intake (for example, glycan degradation; Fig. 4 and Supplementary Table 15). Notably, microbial functions associated with dairy consumption (that is, beta-galactosidase or lactase; EC 3.2.1.23) were highly abundant in these modern human oral microbiomes (Fig. 4 and Supplementary Table 15).

In our ancient dataset, we identified 81.0% (34 of 42) of the amino acid metabolism pathways associated with herbivory or carnivory in ancient samples (Supplementary Table 15). While 88% were significantly more abundant in one of the two microbial communities (Fig. 4 and Supplementary Fig. 8), both microbiomes possessed functions consistent with an omnivorous diet (Fig. 4 and Supplementary Fig. 8). *Streptococcus*-associated communities contained more microbial functions significantly linked with low-fibre (70% of the 16 identified fibre digestion functions; galactose metabolism, glycosphingolipid biosynthesis and glycan degradation; Fig. 4 and Supplementary Fig. 9) and high-carbohydrate diets (46.8% of the 124 carbohydrate-metabolism-associated genes, compared with 22.6% in *Methanobrevibacter*-associated communities), including pathways linked to fructose, sucrose, trehalose, mannose, beta-glucoside and maltose metabolism (Fig. 4 and Supplementary Fig. 10). By contrast, *Methanobrevibacter*-associated communities were enriched for functions linked to methanogenesis, gluconeogenesis and xylose utilization (Fig. 4 and Supplementary Fig. 10). Lastly, *Streptococcus*-associated individuals showed increased abundances of microbial functions linked to dairy consumption (26.7% of lactose metabolism genes were significantly enriched compared with 6.7% in *Methanobrevibacter*-associated communities; Fig. 4 and Supplementary Fig. 11), including a significant enrichment in alpha- and beta-galactosidases, similar to observations in modern individuals

(Supplementary Fig. 11 and Supplementary Table 15). This observation may reflect differences in dairy consumption or access across Britain, which is consistent with the presence of milk proteins in only one-third of medieval calculus samples from Britain (800 BCE to 1895 CE)⁴⁸, even though dairy products were widely available⁴⁹. Together, this analysis represents a powerful instrument in a growing toolbox of biomolecular approaches to reconstruct past diets and suggests that past carbohydrate and dairy consumption may be reflected in the oral microbiome of past British populations.

Specific oral microbiome compositional shifts were observed in London

As large-scale geographic differences across Great Britain may mask factors that drive oral microbiome variation through time⁴⁹, we further narrowed our analysis to 127 medieval and post-medieval (1066 to 1853 CE) individuals from London that have been extensively studied to further explore the origin of these two distinct oral communities, while again controlling for oral geography effects (Supplementary Tables 16–18). As seen in the above Britain-wide analysis, the physiological or cultural factors considered did not appear to significantly contribute to past Londoners' oral microbiome composition ($P > 0.05$; Table 1). However, the presence of disease, as defined by 14 detailed oral and other systemic health indicators previously recorded on the bones and teeth of the individuals included in this study in the Wellcome Osteological Research Database, did potentially explain some of the differences in oral microbiome composition. In London, periodontal disease (but not caries, abscesses or dental developmental defects) was significantly linked to oral microbiome composition ($R^2 > 0.05$, $P < 0.05$; Table 1). Again, microbial species positively associated with periodontal disease were, rather unexpectedly, more commonly found in *Streptococcus*-associated communities, rather than in *Methanobrevibacter*-associated ones (Supplementary Table 19). However, the *Methanobrevibacter*-associated communities were associated with the presence of several skeletal markers of systemic disease, including non-specific periostitis, joint porosity, osteophytic lipping and overall scores for joint pathologies ($R^2 > 0.05$, $P < 0.05$; Table 1). While there could be multiple causes for these skeletal markers, most are thought to be related to inflammatory-associated conditions. Each of these disease markers was also linked to specific genera within the *Methanobrevibacter*-associated community (Supplementary Table 19), such as *Methanobrevibacter*, *Eubacterium*, *Pseudoramibacter*, *Mogibacterium* and *Peptoniphilus* taxa (Supplementary Table 19). While not all systemic diseases contribute to morphological changes in the skeleton, the association between oral microbiomes and systemic diseases has been clearly shown in modern individuals, often through inflammatory pathways^{50,51}. While cause and effect remain unclear, or may be the result of indirect associations (for example, socioeconomic status), our study has linked ancient microbiomes to systemic diseases that manifest in the skeleton and, therefore, provides a new model to examine the origins of modern chronic, non-communicable diseases.

Methanobrevibacter over time

Lastly, we examine why this distinct *Methanobrevibacter*-associated oral ecology is not commonly found today in industrialized populations by exploring its presence over time. In all of Britain, the *Methanobrevibacter*-associated community was first observed in individuals ~2,200 years ago and was still present in London until at least ~1853

(Supplementary Fig. 12). We then examined compositional shifts over time in just London. Oral microbiome composition significantly shifted across 300 and 400 year intervals ($P < 0.05$; Table 1) and significantly shifted after the arrival of the Second Plague Pandemic in London in 1348. The arrival of *Y. pestis* was verified in plague cemeteries (for example, East Smithfield)⁵² and resulted in the deaths of over 30–50% of Londoners between 1348 and 1351 alone⁵³, changing the population structure and ways of life in the city substantially. As temporal differences can be confounded by taphonomy, we examined these compositional shifts in the context of the Second Plague Pandemic more closely by fitting a Bayesian multinomial logistic-normal linear model to the overall oral microbiome composition from historic London, which included the arrival of the Second Plague Pandemic as a covariate and minimized the impacts of oral geography and cemetery location. Our results show that 10.88% of the total variation in microbiome composition can be explained by temporal changes, including the arrival of the Second Plague Pandemic (95% credible interval: 4.98% to 19.47%), while only 65.41% of that signal could be equally explained by other factors (Supplementary Section 6). In addition, only 1.5% of the variation explained by burial location was attributed to DNA damage patterns (deltaD) detected within oral taxa *Anaerolineaceae*, *M. oralis*, *P. gingivalis* and *S. sanguinis* (Supplementary Table 13 and Supplementary Section 6), suggesting this observation is not driven by taphonomy. While this finding needs further examination, temporal shifts in oral microbiome composition coinciding with the Second Plague Pandemic in London could be the result of disease selection and susceptibility during the pandemic^{54,55}, subsequent advancements in public health and hygiene⁵⁶, dietary shifts and/or cultural shifts that were a consequence of this devastating pandemic on the citizens of London.

Discussion

Our study reveals the existence of a now rare or potentially extinct oral microbial ecosystem that was present in British populations over at least 2,200 years alongside other oral microbiome communities. This oral microbial community persisted through major biocultural transitions and historically important socio-political events, only to diminish in recent history—a phenomenon associated with the rise of industrialization. Why this *Methanobrevibacter*-associated community disappeared in Britain or has not yet been described in healthy modern, industrialized societies remains unknown, but reports of broad-spread *Methanobrevibacter* species in the ancient calculus literature suggest that this community may have once been widespread³³. Our findings suggest that advancements in modern dentistry (for example, the routine removal of large calculus deposits and the use of modern oral hygiene products), shifts in dairy and carbohydrate consumption, and medical care may have additionally contributed to its perceived absence today, although further work should explore additional lifestyle changes post-1900s, including migration and nutrition. This finding establishes a new paradigm to explore the foundations and origins of chronic, non-communicable disease in living populations and opens the door to identify unknown (now extinct) microbial diversity in past, pre-industrialized human populations.

Methods

Sample information and collection

For calculus samples obtained from individuals who lived in Britain, access was provided by the Natural History Museum, Royal College of Surgeons of England, Oxford Archaeology East and Aberdeen Museum (Supplementary Table 1). For samples from historic London, 160 archaeological samples were collected from individuals buried at eight different cemeteries in a 16 km² section of London, which formed a continuous temporal sequence from ~1000 to 1853 CE, from the curated archaeological skeletal remains collection stored at the Museum of London. No statistical methods were used to predetermine sample sizes, but our sample sizes are similar to and generally exceed those reported in previous publications^{20,49}. Detailed information on each sample is provided in Supplementary Table 1. Samples were handled using sterile procedures as previously outlined²⁰. Intact calculus samples were stored in labelled, sterile plastic bags and transported to the ancient DNA facility at the Australian Centre for Ancient DNA, University of Adelaide, Australia.

Decontamination, DNA extraction and library preparation

Careful consideration was given to the risk of laboratory and environmental contamination, as endogenous signals can be easily obscured or misinterpreted owing to contaminating microbial DNA^{26,27}. To minimize contamination, samples were processed in an ultra-sterile, specialized ancient DNA laboratory and underwent a decontamination protocol, as previously published³⁹. Samples underwent an in-house, silica-based DNA extraction, as previously described^{20,57,58}. Extraction blank controls were incorporated throughout to monitor laboratory and reagent contamination at a ratio of two extraction blank controls to ten samples, as well as no template controls during the amplification process⁵⁹. Shotgun libraries were generated using a previous protocol²⁰. Samples were sequenced on an Illumina NextSeq using a high-output 2 × 150 bp kit. Further details about the methods are available in the Supplementary Text.

Bioinformatic and statistical analysis

DNA sequences were demultiplexed, trimmed and merged using AdapterRemoval2.0 with a 5 bp overlap⁶⁰. Taxonomic and functional information was derived from analysis-ready reads using MALT_x²⁰ against the 2014nr database. Taxonomic comparisons were also completed using MALT_n against the 2017 RefSeq GCS database (Supplementary Section 3). Only collapsed reads were used because fragments greater than 300 bp were considered more likely to be modern DNA contamination¹⁹. A total of 14 samples with a Bray–Curtis dissimilarity value >0.72 (the similarity of negative controls to themselves) compared with the negative controls were excluded. Next, all species identified within the negative control samples were conservatively removed from all samples; genera and higher classifications of data were not filtered. Four samples with <100,000 DNA sequences were also removed, as these are unlikely to capture overall microbial community structures²². We also authenticated the oral signal in our samples using a range of ancient calculus, modern calculus and plaque, soil, and laboratory controls using SourceTracker2.0 (ref. 61), and we verified DNA damage consistent with known ages of samples using both a reference-free

approach using ChangePoint analysis²³ and the reference-based gold-standard approach MapDamage2.0 (ref. 24) against oral and contaminant species (Supplementary Section 3).

To identify correlations with metadata and taxonomic data, taxonomic information from modern and ancient samples was exported from MEGAN6 CE and imported into QIIME2 (V2020.2.0)⁶², and singletons were removed. We rarefied the dataset to the maximum number of sequences available (100,000 for all taxa, 60,000 for genera and 30,000 for species per sample). Bray–Curtis dissimilarity was calculated with biplots, and the ADONIS test was applied (9,999 permutations) to identify factors that shaped beta diversity in the dataset. As each ADONIS test incorporates multiple variables, a correction for multiple tests may not be necessary. Nevertheless, we report $P < 0.05$ as significant, and we highlight which results are also significant when applying a Bonferroni correction to account for multiple ADONIS tests (that is, $P < 0.002$; Table 1). LefSe analysis was conducted to identify specific species that increased in abundance with select metadata fields⁶³. To explore the functional potential of the microbiomes, functional tables were exported from MEGAN6 CE into QIIME2. Amino acid functions matching the Enzyme Commission numbers identified as distinguishing of carnivores and herbivores⁴⁶ were exported. For carbohydrate and dairy metabolism, all level 4 functional groups were exported. Fibre metabolism functions⁶⁴ were exported from the KEGG database within MEGAN5. ADONIS tests were run on functional data as done with taxonomic data, and LefSE analysis was conducted to identify specific functions that increased in abundance with select metadata fields.

Project outreach

To promote this project and provide ways for non-scientists to engage with this work, we engaged visitors to the Museum of London in conversations during the sampling period of this study. A stall was set up in the public galleries of the museum for one afternoon within the five day sampling visit. The stall consisted of a single table, skulls and models from the museum's Centre for Human Bioarchaeology teaching collection, and a conference poster. The teaching collection and poster served to attract attention and trigger conversation. Conversational engagement allowed the public to ask their own questions about the topics that interested them. Discussions included the active project, background to the field, broader anthropological questions and discussions of our team members' career path. In doing this, we offered an opportunity to engage with the public and support diverse and active learning in museums, enhancing science capital⁶⁵, while promoting the active research and ongoing partnerships of these institutions.

Ethics statement

Ancient human samples are not subject to institutional review board approvals; however, this study was reviewed by the University of Adelaide Human Research Ethics Committee and received approval (H-2012–108).

Reporting summary

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

Acknowledgements

We thank C. Stringer and R. Kruszynski of the Natural History Museum, London; S. Schiffels; D. Sayer; Oxford Archaeology East; M. Farrell of the Royal College of Surgeons of England; J. Pearson of the Inverness Museum; and all of the museums for access to samples. We also thank the Museum of London for allowing us to collect and destructively analyse archaeological dental calculus samples from their collections from London, particularly J. Bekvalac and R. Redfern. We would also like to acknowledge J. VanderBerg at EnDev Geographic for producing the map used in Fig. 1. A.C., C.A. and L.W. thank the Australian Research Council for research funding (DP110105038) and Laureate (FL140100260). The work was also supported by an Australian Research Council Future Fellowship Award to L.S.W. (FT180100407). This material is also based on work supported by the National Science Foundation Graduate Research Fellowship Program awarded to A.S.G. under Grant No. DGE1255832. Any opinions, findings, and conclusions or recommendations expressed in this material are those of the authors and do not necessarily reflect the views of the National Science Foundation.

Data availability

All trimmed and merged DNA sequences (fastq) are available in the SRA database (BioProject PRJNA780005) of NCBI. The 2017 NCBI nr database and the 2017 NCBI RefSeq GCS database were used in this study. Unmerged reads can be made available upon request, as only merged sequences were assessed in full for this publication.

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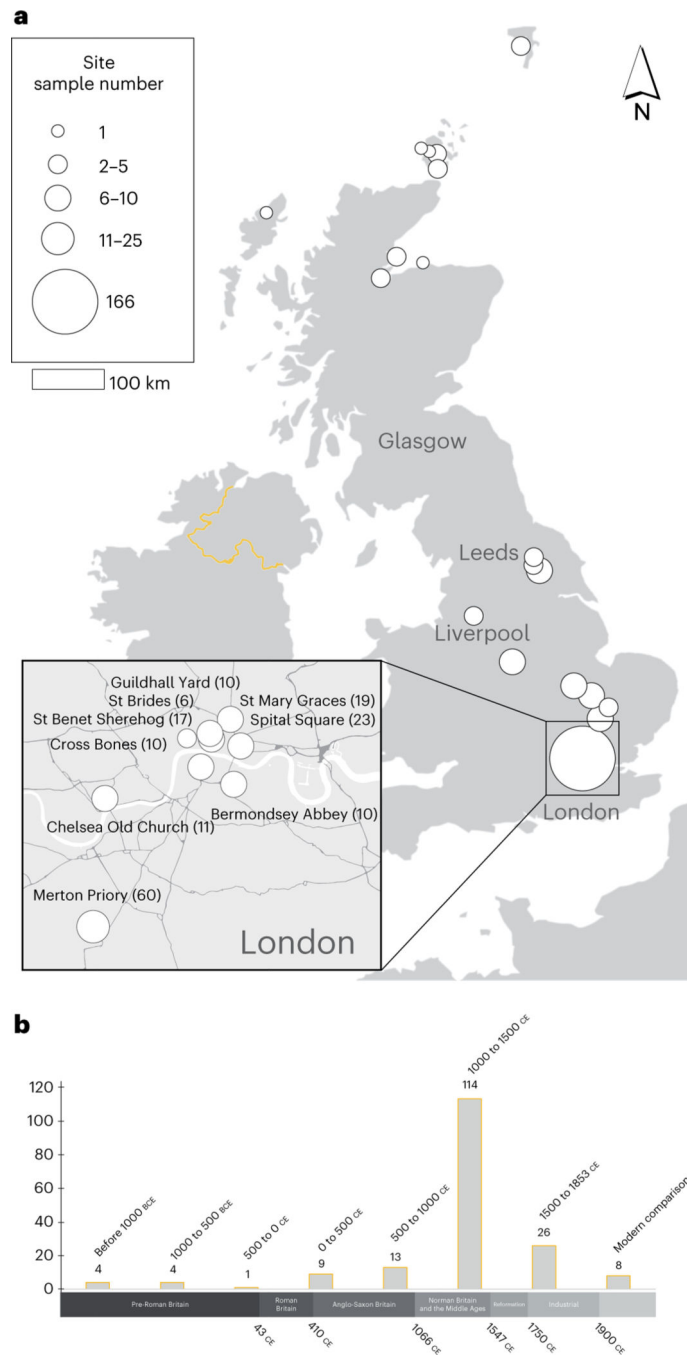


Fig. 1|. Geographical and temporal distribution of samples.

a, Map showing the locations of the archaeological sites examined in this study across the British Isles. Each site is represented by a circle, and the size of the circle corresponds to the number of dental calculus samples examined from that site. A total of 235 individuals and 27 sites were sampled. **b**, The number of dental calculus samples from each time period is shown. The broad time periods and associated dates are Pre-Roman Britain (–43 CE), Roman Britain (43–410 CE), Anglo-Saxon or Early Medieval Britain (410–1066 CE),

Norman Britain and the Middle Ages (1066–1547 CE), Reformation (1547–1750 ce) and Industrial (1750–1900 CE).

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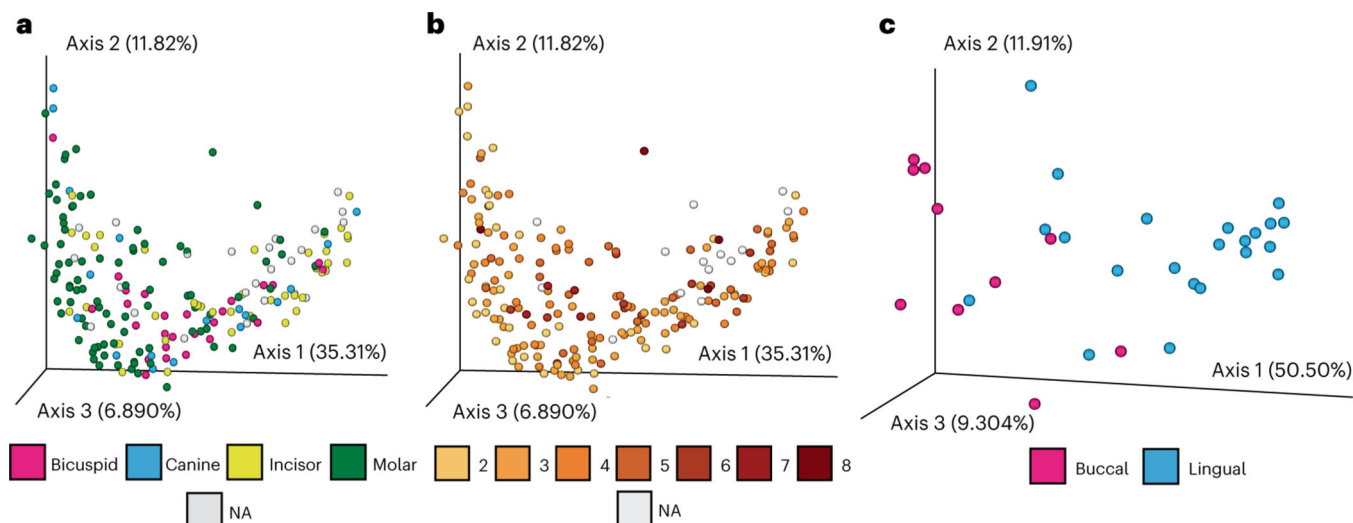


Fig. 2 |. Oral geography and microbial compositions.

a–c, The contributions of oral geography on bacterial and archaeal taxonomic compositions are shown by performing PCoA of Bray–Curtis distances for all teeth. The oral microbiota composition of each calculus sample is coloured according to the tooth that was sampled (**a**), the approximated size of the dental calculus sample obtained for DNA extraction as described in Supplementary Information (**b**) or the surface of the tooth that was sampled, shown for molar teeth only (**c**). When information regarding oral geography was unavailable, samples are labeled as not applicable or ‘NA’.

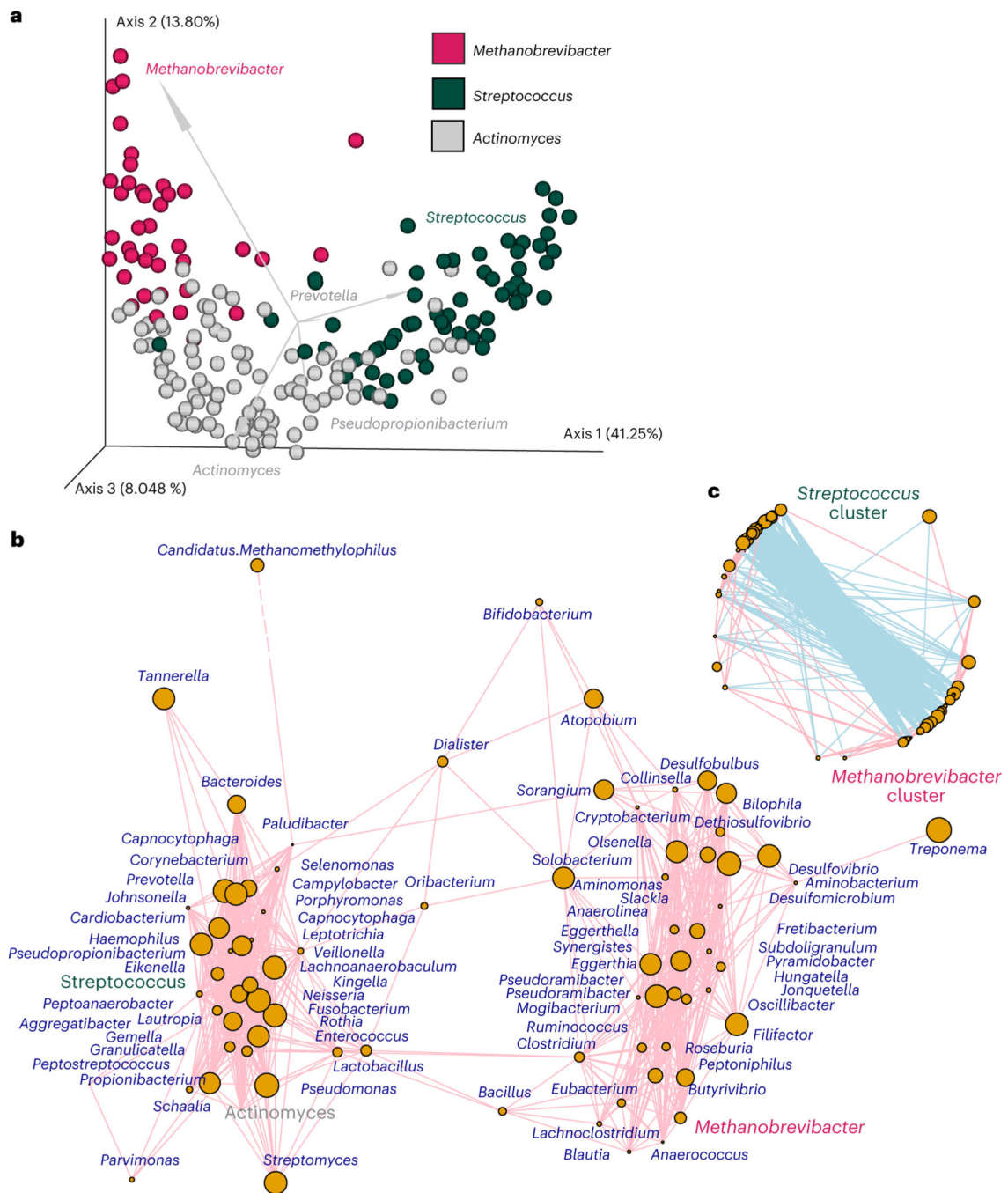


Fig. 3 | Exploration of dominant taxa and communities.

a, PCoA plot showing differences in Bray–Curtis distances of microbial genera present in each sample. Biplots are also shown using arrows for the top five most significant genera, with the length of the arrow proportional to its magnitude. Samples are coloured according to which the top three genera identified via biplots (*Actinomyces*, *Streptococcus* or *Methanobrevibacter*) were most dominant within each sample; samples that contained either more *Actinomyces*, *Streptococcus* or *Methanobrevibacter* are coloured grey, green or pink, respectively. **b,c**, CCLasso was used to identify genera that positively (**b**) or negatively (**c**)

(c) co-occurred in all samples; the top three genera identified using biplots are coloured as in a: *Actinomyces* associated (grey), *Streptococcus* associated (green) and *Methanobrevibacter* associated (pink).

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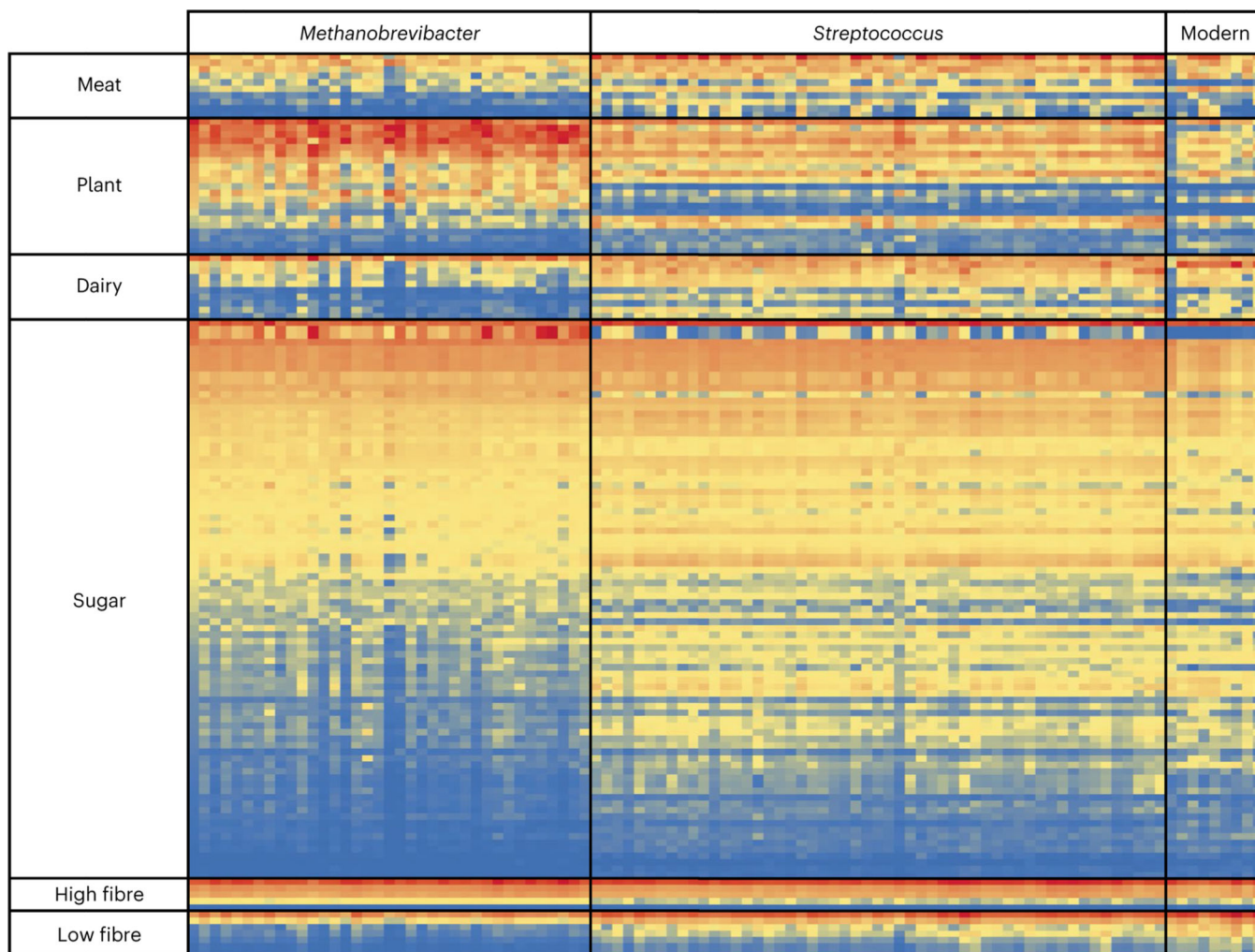


Fig. 4 | Abundance of dietary microbial functions in ancient Britain.

Normalized relative abundances of dietary microbial functions found to be differentially abundant using a Benjamini–Hochberg-corrected P value of a two-tailed Welch’s t -test ($P < 0.05$) in ALDEx2 are shown for *Streptococcus*-associated, *Methanobrevibacter*-associated and modern oral microbiomes. Red colouring represents high abundances, yellow is medium and blue represents low; the colouring is normalized within each dietary function category. A full list of functions tested is shown in Supplementary Table 14, and a full version of this differential abundance analysis is shown in Supplementary Table 15.

ADONIS of culture and health variables for all teeth and molars, with factors based on oral geography tables accounted into models for Museum of London samples only

Table 1 |

Variable (all teeth)	Species		Genera		All taxa	
	R ²	Pr(>F)	R ²	Pr(>F)	R ²	Pr(>F)
Black Death (1346–1353)	0.042271	0.013	0.030313	0.048	0.025943	0.115
Civil war (before, after or during)	0.016108	0.135	0.011964	0.283	0.01031	0.342
Date (300 year intervals)	0.034836	0.048	0.024156	0.198	0.022078	0.221
Date (400 year intervals)	0.029446	0.013	0.016392	0.12	0.013127	0.203
Overall pathology	0.006137	0.755	0.008607	0.449	0.004815	0.737
Blood disorder	0.004924	0.874	0.006369	0.667	0.003584	0.875
Non-specific periostitis	0.011312	0.376	0.008351	0.485	0.006533	0.55
Overall vertebral pathology	0.007189	0.668	0.006596	0.6	0.002856	0.936
Vertebral pathology (facets)	0.011992	0.398	0.011231	0.326	0.008289	0.482
Vertebral pathology (Schmorl's nodes)	0.01889	0.163	0.014865	0.201	0.012520	0.248
Vertebral anomaly	0.003516	0.975	0.00074	0.999	0.003231	0.928
Overall joint score	0.014469	0.339	0.013742	0.278	0.008986	0.476
Osteophytic lipping (joints)	0.016424	0.252	0.015658	0.2	0.013047	0.293
Porosity (joint)	0.018879	0.2	0.016178	0.216	0.008034	0.561
Dental abscess	0.007348	0.802	0.006688	0.831	0.008883	0.689
Carries	0.013519	0.365	0.010129	0.552	0.006764	0.742

	Species		Genera		All taxa	
	<i>R</i> ²	Pr(> <i>F</i>)	<i>R</i> ²	Pr(> <i>F</i>)	<i>R</i> ²	Pr(> <i>F</i>)
Hypoplasia	0.016002	0.315	0.014795	0.32	0.012569	0.413
Periodontitis	0.007565	0.738	0.006348	0.791	0.003939	0.936
Class	0.050463	0.817	0.047845	0.842	ND	ND
Hospital	0.008254	0.583	0.006867	0.68	0.003706	0.89
Rank	0.024601	0.375	0.022691	0.419	0.013996	0.698
Religion	0.069326	0.37	0.065258	0.523	ND	ND
Empire	0.022583	0.161	0.024645	0.121	0.009261	0.296
Sex	0.012235	0.229	0.010149	0.346	0.007244	0.506
Cemetery	0.078145	0.066	0.06099	0.307	0.056177	0.38
Rural versus urban	0.015152	0.454	0.013429	0.55	0.008919	0.73
Medieval versus post-medieval	0.013773	0.126	0.013609	0.107	0.009232	0.233
Age	0.0334	0.14	0.040031	0.053	0.039874	0.074
Dominant community	0.295798	0.001	0.278079	0.001	0.270359	0.001
Variable (molars)						
Black Death (1346–1353)	0.051076	0.141	0.034373	0.529	ND	ND
Civil war (before, after or during)	0.030608	0.245	0.025953	0.287	0.22388	0.33
Date (300 year intervals)	0.045842	0.356	0.040998	0.438	0.033105	0.646
Date (400 year intervals)	0.033868	0.137	0.027913	0.238	0.023156	0.329
Overall pathology	0.036885	0.071	0.053478	0.119	0.047454	<i>0.014</i>
Blood disorder	0.029438	0.135	0.04632	0.157	0.029031	0.121

	Species		Genera		All taxa	
	<i>R</i> ²	Pr(> <i>F</i>)	<i>R</i> ²	Pr(> <i>F</i>)	<i>R</i> ²	Pr(> <i>F</i>)
Non-specific periostitis*	0.073858	0.001	0.068745	<i>0.04</i>	0.066492	0.002
Overall vertebral pathology	0.032115	0.101	0.022347	0.595	0.027613	0.146
Vertebral pathology (facets)	0.017843	0.464	0.034455	0.369	0.011874	0.801
Vertebral pathology (Schmorl's nodes)	0.020959	0.367	0.0136	0.908	0.017336	0.485
Vertebral anomaly	0.007946	0.931	0.005958	0.998	0.012164	0.737
Overall joint score	0.064592	0.007	0.100103	<i>0.018</i>	0.059902	<i>0.012</i>
Osteophytic lipping (joints)	0.064268	<i>0.007</i>	0.099268	<i>0.022</i>	0.060218	<i>0.006</i>
Porosity (joint)	0.057578	<i>0.014</i>	0.099376	<i>0.016</i>	0.05229	<i>0.022</i>
Dental abscess	0.034019	0.262	0.035143	0.531	0.036956	0.209
Caries	0.019593	0.573	0.031298	0.502	0.024434	0.334
Hypoplasia	0.027694	0.268	0.036616	0.442	0.026032	0.291
Periodontitis	0.011512	0.833	0.025481	0.633	0.015703	<i>0.026032</i>
Class	ND	ND	ND	ND	ND	ND
Hospital	0.023396	0.234	0.035948	0.274	0.026313	0.177
Rank	0.024147	0.82	ND	ND	0.022222	0.852
Religion	0.095904	0.117	ND	ND	0.093495	0.104
Empire	0.032085	0.089	0.026332	0.185	0.019894	0.321
Sex	0.0239	0.376	0.032519	0.187	0.023802	0.365
Cemetery	0.087245	0.159	0.088173	0.158	0.06858	0.385
Medieval or post-medieval	0.030868	0.117	0.025388	0.169	0.019233	0.346

	Species		Genera		All taxa	
	R^2	Pr(>F)	R^2	Pr(>F)	R^2	Pr(>F)
Rural versus urban	0.033662	0.503	0.062878	0.296	0.037808	0.393
Age	0.049095	0.619	0.058474	0.37	0.047467	0.573
Dominant community	0.221255	0.001	0.237476	0.001	0.187197	0.001

Bolding indicates a variable with significant results ($P < 0.05$).

* Significantly associated with the dominant category. The results from the ADONIS analysis on the beta diversity (Bray–Curtis) of oral microbiota from all London individuals are shown. The fit of the test (R^2) and the P value for each test are shown for all species, all genera or all taxa present in each sample, after accounting for oral geography. Significant results are in italics ($P < 0.05$). Results significant after implementing a Bonferroni correction are denarated with *. Taxa driving these shifts (Supplementary Fig. 17) and linkages to the dominant associated taxa (Supplementary Table 23) are presented in the Supplementary Text. ND indicates not determined (e.g. tests could not be performed due to small samples sizes).