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# Bacterial biogeography of the human digestive tract

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We present bacterial biogeography as sampled from the human gastrointestinal tract of four healthy subjects. This study generated >32 million paired-end sequences of bacterial 16S rRNA genes (V3 region) representing >95,000 unique operational taxonomic units (OTUs; 97% similarity clusters), with >99% Good's coverage for all samples. The highest OTU richness and phylogenetic diversity was found in the mouth samples. The microbial communities of multiple biopsy sites within the colon were highly similar within individuals and largely distinct from those in stool. Within an individual, OTU overlap among broad site definitions (mouth, stomach/duodenum, colon and stool) ranged from 32-110 OTUs, 25 of which were common to all individuals and included OTUs affiliated with *Faecalibacterium prasnitzii* and the TM7 phylum. This first comprehensive characterization of the abundant and rare microflora found along the healthy human digestive tract represents essential groundwork to investigate further how the human microbiome relates to health and disease.

The diverse microbial communities that dwell in the human body are linked intimately with aspects of host metabolism, physiology and function including maturation of the immune system<sup>1</sup>, energy balance<sup>2</sup>, susceptibility to disease<sup>3-5</sup>, and behavior<sup>6.7</sup>. Recent research has begun to enumerate the microbial species inhabiting the mouth<sup>8.9</sup> and the distal colon, with emphasis on studies of gut colonization<sup>10,11</sup>, and populations that are present in both health<sup>12,13</sup> and disease<sup>14,15</sup>. Despite the impact of the oral and gastrointestinal (GI) microbiome on human health, a taxonomic baseline, consisting of a comprehensive survey of the diversity and distribution of microbial communities within healthy human beings, is lacking. This is due to several issues including difficulties in cultivating host-associated microorganisms, lack of suitable molecular methods for comprehensive characterization of complex microbial communities, and the relative difficulty in obtaining internal human mucosal samples for analysis. Although culturing microorganisms sampled from human body sites continues to provide valuable insight into the bacterial populations present, knowledge of the human microbiome has been expanded greatly by culture-independent techniques such as fluorescence microscopy,

bacterial phylogenetic microarrays, 16S rRNA gene sequencing and metagenomics.

Culture-independent methods have revealed unexpected microbial diversity at sites such as the mouth<sup>8</sup> and stomach<sup>16</sup>. Preliminary next-generation sequencing studies have achieved greater coverage of the microbial populations associated with multiple human body sites. In particular, global surveys of feces and external body sites<sup>17–20</sup>, the oral cavity<sup>13</sup> and selective sampling of the human digestive tract<sup>21</sup> reveal high diversity, site-specific clustering of community composition and taxonomic uniqueness between individuals. However, until now there have been no studies that have profiled the microbial communities associated with the complete human digestive system in healthy individuals. The comprehensive characterization of normal microbial communities associated with the human GI tract is a critical prerequisite to understanding and predicting alterations in these communities in relation to disease. Here we address this lack of knowledge by generating an extensive taxonomic baseline for the human digestive system using next-generation 16S rRNA gene sequencing, leveraging Illumina sequencing technology<sup>22</sup>. Using this approach, we address as-yet unanswered questions such as: How do microbial communities change along the length of the GI tract? Which bacterial assemblages inhabit each GI location? Are bacterial profiles in feces the same as those associated with intestinal mucosa? Do abundant bacteria differ fundamentally from those found at relatively low abundance (i.e. the "rare biosphere")?

In this study, the  $\sim$ 150-base long V3 region ( $\sim$ 200 base PCR amplicons) of the 16S rRNA gene was amplified from bacterial populations present at several oral locations and along the gastrointestinal tract of four healthy individuals (two females and two males). The samples included mouth plaque (left and right supra-gingival and sub-gingival, tongue), stomach (antrum and body), duodenum, colon (transverse and descending), rectum and stool. The results show that bacterial communities cluster by sample site and that specific bacterial populations are characteristic of different human GI sites. Microbial communities shift along the length of the digestive tract, exhibiting clear differences even between colon mucosal and fecal profiles. Despite the depth of sampling, most accumulation curves did not plateau. The abundant and rare organisms within each library belonged to similar taxonomic groups, although there was an increase in the proportion of unclassified OTUs among rare sequences. This study represents the first internal biogeographic map of the complete human digestive system, and therefore it represents an essential baseline to support further studies linking microbial communities with aspects of human health and disease.

### Results

Patient samples and Illumina libraries. For each healthy individual (two males, two females), the samples included dental plaque (left and right supra-gingival and sub-gingival, tongue), stomach (antrum and body), duodenum, colon (transverse and descending), rectum and stool. The stool was collected within 24 hours of GI sampling and prior to Klean Prep of the colon whereas all other GI and oral samples were collected on the same day for each individual at the time of gastroscopy and colonoscopy. Libraries were constructed for all samples by amplification of the V3 region of the bacterial 16S rRNA gene. A unique index was used to label each sample and multiplex Illumina sequencing resulted in 46,960,900 paired-end reads. Removal of low-quality and short (<100 nucleotide) sequences followed by perfect-match assembly reduced the total to 32,770,833 assembled sequences with an average length of 149.3  $\pm$ 10.9 bases (sequenced primer regions removed). Clustering at 97% identity produced 97,252 unique operational taxonomic units (OTUs) of which 56,910 (0.17% of sequences) were singletons (occurring once in only one sample; Table S2). Good's coverage was high with an average of 0.996 across all samples.

In parallel to human samples, we conducted a validation of the Illumina sequencing approach. This validation consisted of prospecting a predefined community, a mixture of DNA from 12 known bacterial cultures, with both Sanger-based sequencing of a single clone library (96 clones), and Illumina sequencing of two technical replicates (>500,000 sequences for each replicate). The Illumina method recovered 16S rRNA gene sequences from all 12 organisms with a reproducible abundance distribution (Fig. S1), confirming the reproducibility of this analytical approach. Fewer Pseudomonas sequences were recovered in the replicate Illumina libraries than expected based on the initial mix ratio. However, no Pseudomonas sequences were detected within the Sanger-sequenced library. These results demonstrate the importance of increased sequencing coverage to offset the loss of detected OTUs by possible methodological biases. Note that additional assessments of alpha diversity were not possible with these data due to low-level sequence contamination likely associated with bacterial growth media, as observed previously<sup>22,23</sup>.

**Sequence clustering and quality.** Because of the large number of singleton sequences, as well as the use of the highly variable V3 region, we tested sequence clustering at different identity thresholds using the CD-HIT algorithm<sup>24</sup> (Table S1). The observed pattern of cluster richness indicated that existing clusters were not diffuse and therefore the selected 97% threshold was appropriate for CD-HIT clustering of true sequences with their derivatives containing sequencing and/or PCR errors.

Using default parameters and a *de novo* analysis, UCHIME identified a non-trivial number of potential chimeric sequences, ranging from 0.01 to 5.9% of total sequences within a sampling site. However, the majority of these sequences did not appear to be legitimate chimeras (data not shown). Furthermore, high-abundance putative chimeras were almost exclusively low-scoring sequences, indicating lower confidence in their identification as chimeras. Modifying UCHIME parameters to decrease false positives in short read sequences, consistent with previous analyses<sup>25</sup>, decreased the number of putative chimeras to < 2% of all sequences at a site, and typically < 0.5%. Because the majority of these sequences corresponded to singletons or low-abundance clusters and alpha diversity measures were not the primary focus of this study, the potential chimeras were not removed from the data for subsequent analyses.

**Microbial community diversity estimates.** Shannon diversity estimates were highest in samples from the mouth (Fig. 1A). Stomach samples were the least diverse and colon and stool samples were highly variable. Phylogenetic diversity in the mouth was significantly higher and much more consistent across individuals than in any of the other locations tested (Fig. 1B). Despite collecting an average of  $\sim$ 700,000 sequences per sample, the accumulation and Chao1 curves did not level off for most samples (Fig. S2).

**Taxonomic characteristics.** Of the nearly 33 million sequences collected in this study, 0.63% and 10.83% could not be assigned to a phylum or genus, respectively (counts for phyla and genera in each sample presented in Tables S3 and S4, respectively). This indicates that the 16S rRNA gene dataset found potentially novel lineages in the human microbiome. This study found 19 known phyla to be present in the oral samples of all individuals, with a predominance of five or six major phyla: Actinobacteria, Bacteroidetes, Firmicutes, Fusobacteria, Proteobacteria and either of Spirochaetes, TM7 or SR1 (Fig. 2). No major differences were observed between supra- and subgingival plaque samples as would be expected in healthy subjects.



Figure 1 | Alpha diversity of each sample. (a) Shannon diversity and (b) phylogenetic diversity (PD) at each body site for all four subjects, where points represent a sample. Five iterations of rarefied subsets of 200,000 sequences from each sample were used to calculate the values for both metrics and the average was plotted. Asterisks indicate statistical significance (Kruskal-Wallis test, p < 0.05).

Although stomach and duodenum samples showed fewer OTUs than other sites, they harbored representatives of most phyla observed throughout the study with the exception of a population of unclassified Cyanobacteria not seen elsewhere. Because a colon prep was applied prior to sampling and Cyanobacteria-related sequences have previously been reported in the colon of humans and the guts of other mammals<sup>26,27</sup>, Cyanobacteria may be resident organisms within the duodenum and not simply DNA sequences transiently present there at the time of collection. Interestingly, three of the four duodenum samples contained larger proportions of Acidobacteria (mainly unclassified Acidobacteria Gp22; Table S4) than any other sampled site. The results of this study reveal substantial OTU diversity in the stomach and duodenum, although, as reflected in their low Shannon indices (Fig. 1), most communities were dominated by only a few genera.

Bacteroidetes and Firmicutes predominated in colon mucosal sites, followed by lower proportions of Proteobacteria and Fusobacteria (Fig. 2). Firmicutes, with a small proportion of Actinobacteria, predominated in three of the four stool samples.

**Sample clustering.** Samples clustered strongly by gastrointestinal site using either weighted or unweighted UniFrac distances (Fig. S3 A and B). Samples clustered first by major body site then by sample sub-site (mainly with unweighted UniFrac), then by subject at colon sites, which were similar to one another and distinct from stool in most cases. Principal coordinate analysis (PCoA) plots using UniFrac distances (Figs. 3 and S4) clustered samples mainly by location (Fig. 3B and S4B), whereas we did not observe clustering due to other variables such as gender (Fig. 3C and S4C) or subject (Fig. 3D and S4D).

The taxonomic information overlaid onto the PCoA plot illustrates the contribution of each bacterial group toward sample similarity, even those occurring at low abundances (phyla such as Verrucomicrobia, TM7 and Spirochaetes, genera such as *Faecalibacterium* and



**Figure 2** | **Genera represented in the digestive tracts of four subjects (S1–S4)**. Bars delineate unique genera and are coloured with the phylum level assignment for each group. A complete list of sequence counts for each phylum and generus grouped by sample are presented in Supplemental tables 3 and 4, respectively. Low abundance phyla comprising the "Other" category include Acidobacteria, Chloroflexi, Deinococcus-Thermus, Euryarchaeota, Lentisphaerae, Planctomycetes, Synergistetes and Tenericutes.

*Haemophilus*) (Figs. 3A and S4A). The dataset contained representatives of 19 known phyla and 436 known genera (Tables S2 and S3, respectively). Colon mucosal communities were largely comprised of known anaerobic microorganisms and the predominant genera at these sites were *Bacteroides, Coprococcus*, and *Faecalibacterium*. A species of the latter genus, *Faecalibacterium prausnitzii* has been implicated in colonic health due to its anti-inflammatory properties<sup>4</sup>. *Bacteroides* are thought to be the key anaerobes in health and disease<sup>28</sup> and were the most abundant genera identified (occurring mainly in colon mucosal sites), making up the bulk of the Bacteroidetes sequences obtained in the study. However, several other genera such as *Prevotella* and *Capnocytophaga* were particularly abundant and important in clustering of oral sample sites.

Within-subject OTU overlap across sites. The overlap of OTU clusters among broad sampling regions (mouth, stomach/duodenum, colon, stool) were calculated with singleton sequences removed. The resulting Venn diagrams demonstrated consistent overlap patterns for each subject (Figure 4). Stool and colon sites had the largest OTU overlap within an individual, with both sites also sharing a large

number of OTUs with the mouth. The stomach and duodenum set of OTUs typically shared the fewest clusters with other body sites. A subset of 32-110 OTUs were present in every sampling region of each individual, with 25 of these OTUs being present in all subjects (Table S5). The abundances of these 25 shared OTUs varied among individuals and sites, but were generally high, ranging from ca. 50,000 - 2,800,000 sequences. Included in this shared subset were *Faecalibacterium*, TM7 and *Streptococcus* (Table S5).

**Tracking species of interest.** The taxonomic composition and dynamics of low-abundance microorganisms in ecosystems are poorly understood. In this study, bacterial OTUs ranked by abundance generally had consistent taxonomic assignments between abundant and rare groups in oral and digestive tract sites (Figs. 5 and S5). Nonetheless, in all subjects and GI sites, the proportion of unclassified sequences increased in low abundance ranks, compared to predominant OTUs.

The potential diagnostic value of large 16S rRNA gene datasets such as those generated in this study is apparent when mining for sequences from species of clinical interest (Fig. 6; Table S6). In



**Figure 3 Contribution of different taxonomic groups to separation of samples based on phylogenetic information.** The contribution of each group is represented by the size of the circles (grey) overlayed onto a PCoA of unweighted UniFrac distances for all samples within the oral and digestive tract. Panels (a–d) represent variations in sample colouration to highlight potential relationships between sample clustering and metadata.



Figure 4 | Venn diagrams demonstrating 97% OTU cluster overlap within broad sampling regions. Numbers correspond to unique OTU clusters within a subset. To highlight shared OTUs, singleton clusters were removed before analysis.

particular, high levels of sequences matching the beneficial species *F. prausnitzii* were present in all the distal gut samples, though they were much more abundant in two of the four individuals. Whenever this species was abundant in the mucosa, it was also abundant in the corresponding stool. On the other hand, the ability to detect sequences of potentially harmful organisms such as *Streptococcus mutans, Treponema denticola* or *Clostridium difficile* at very low relative abundances has potential diagnostic value and possible prophylactic applications. In this study, the observation of *C. difficile*-like sequences at low-relative abundance in all subjects provides useful insight into the prevalence of this potential bacterial pathogen.

### Discussion

This study generated >32 million sequences representing >95,000 unique OTUs with >99% Good's coverage for all samples. Interindividual variability is a hallmark of human microbiome studies. Accordingly, there was more phylogenetic variability between subjects than there was between sample sites from within each GI location (e.g. mouth, large intestine), likely due to the similarity in redox conditions and availability of nutrients at sites compared with the variability of host-specific factors such as diet or oral hygiene. This is not surprising if the gastrointestinal tract is thought of as a changing ecosystem where adaptable microbial communities are replaced continually by functionally similar representatives in each host<sup>20</sup>. Nonetheless, although the types of organisms present within each person are distinct at the OTU level, they are very similar at higher taxonomic levels.

The mouth samples contained the most phylogenetically similar microbiomes across subjects. This observation concurs with those made from shallower sequence sampling coverage by Costello and coworkers<sup>17</sup>. The most abundant microbial populations found within the oral sites here were also observed in previous 16S rRNA gene surveys<sup>8,29</sup>, whereas some of the low-abundance groups seen in this study, such as Alphaproteobacteria, Coriobacteridae, Acidobacteria, Deltaproteobacteria and Deinococci, were found in a recent PCR-independent metagenomic study of oral communities<sup>30</sup>. This suggests

that our method not only reproduces the results of previous 16S rRNA gene screens but can identify low abundance organisms not usually detected with less sequence coverage. These results reinforce the notion of the mouth as the entry point for GI bacteria (highest diversity) with selection for a subset of the total diversity occurring as these organisms pass through the gastrointestinal tract. The microbial diversity associated with mouth samples was similar to that observed in a previous pyrosequencing study of oral microflora<sup>31</sup>. Our study found greater OTU numbers in the stomach than previous studies<sup>16</sup>, likely due to the greater sequencing depth achieved here. Recent evidence for diverse microbial populations within the stomach has challenged the traditional notion that the upper GI tract is nearly sterile<sup>16,32</sup>. Further research is required to assess the extent to which these findings reflect genuine diversity, or whether alpha diversity measures (e.g. Fig S2) continue to be inflated by artifacts of next-generation sequencing approaches<sup>33</sup>. As in the murine gut<sup>12</sup>, diversity along the GI track increased from stomach to stool. Bacterial density and growth rates are also known to change along the GI track<sup>34</sup>. In agreement with previous reports including those using metagenomes sequences<sup>35</sup>, the abundant organisms in colon and stool samples were similar between individuals, with inter-individual variation occurring in the least abundant groups.

The taxonomic groups represented within the GI tract were similar overall to previous findings<sup>13,21</sup>, where these sites were investigated separately. Here, due to the collection of multiple samples from the same individual within a short timeframe, gradients of microbial community composition as well as distinct differences at different body sites along the digestive tract were apparent (Fig. 4). Bacterial communities in the oral cavity were made up of different taxonomic groups and were phylogenetically distinct from those at colon sites (based on UniFrac), whereas there was an observable representation of bacterial taxonomic groups in both the mouth and colon but not stool (as with Fusobacteria in Subject 2 and Proteobacteria in Subject 3; Fig. 2). These results point to a seeding of mucosal (colonic) communities with organisms from higher up in the digestive tract. Within multi-site shared OTUs (Fig. 4), those related to both *Faecalibacterium* and TM7 (among others; Table S5) were associated



Figure 5 Rank abundance plots and proportional taxonomic bar plots for sequences from Subject 1 pooled within various body sites and assigned to order. To demonstrate taxonomic distribution at decreasing ranks, the data were split according to different logarithmic abundance ranges as appropriate. The low abundance orders comprising the "Other" category included Synergistales, Halanaerobiales, Mycoplasmatales, Xanthomonadales, Sphingobacteriales, Caulobacterales, Desulfobacterales, Legionellales, Oceanospirillales, Deinococcales, Methanobacteriales, Myxococcales, Anaerolineales, Methylophilales, Chromatiales, Thermales, Bdellovibrionales, Planctomycetales, Solirubrobacterales, Methanomicrobiales, Planctomycetales,

Methylococcales, Anaeroplasmatales, Coriobacteriales, Desulfovibrionales, Rhizobiales, Rhodocyclales, Sphingomonadales, Victivallales. Plots for subjects 2–4 are available in Figures S5.

with all general site locations (e.g. mouth, stomach/duodenum, colon, stool) in all individuals. It is interesting to note the all-subject and all-site distribution for sequences of *Faecalibacterium*-like bacteria (Table S5), which have been associated with anti-inflammatory properties in patients with Crohn disease<sup>4</sup>. This distribution suggests widespread exposure and continuous seeding of this beneficial bacterium in humans. TM7-related bacteria represents a largely uncultivated phylum<sup>36</sup>, with corresponding sequences associated with a variety of human body samples ranging from the mouth<sup>29,37,38</sup>, associated with chronic periodontitis<sup>39</sup>, and other body sites such as the esophagus<sup>40</sup>, stomach<sup>16</sup>, intestines<sup>41</sup>, vaginal secretions<sup>42</sup> and skin<sup>43</sup>. It will be useful to assess the widespread distribution of the core 25 OTUs shared between all sites in additional individuals.

Previous studies of luminal bacterial communities have reported different ratios of Firmicuties, Bacteroidetes and Actinobacteria in stool samples, with some samples entirely dominated by Firmicutes<sup>21</sup>. The ratio of Firmicutes to Bacteroidetes within stool has recently been suggested to fluctuate with the body mass index (BMI) of the individuals sampled<sup>12</sup>. Although we sampled only four individuals, we noted that the ratios of Firmicutes to Bacteroidetes within the intestinal mucosal and stool samples were not the same (Fig. 2). This difference in ratio suggests that the specific relationships with BMI that were found previously may differ for luminal (stool) and mucosa-associated bacterial communities. Additional research would be required to determine whether this observation is generally consistent across individuals although a previous study has also shown stool microbial profiles that are distinct from fecal profiles<sup>27</sup>.

The number of sequences obtained and the low cost of Illumina sequencing were especially helpful in the detection of sequences occurring below traditional detection levels. The analyses of lowabundance sequences (Fig. 5, Fig. S5) indicate that only relatively minor shifts in taxonomic representation occur among scarce OTUs, still with a small proportion of unclassified organisms, at all sites within the human GI tract. This observation contrasts with the patterns observed recently in Arctic tundra soil<sup>22</sup>, where low-abundance OTUs belonged to different taxonomic groups from those of highabundance OTUs. However, in agreement with previous observations<sup>22,44</sup>, we observed an increasing proportion of unknown or unclassified organisms among rare OTUs. Because phylogenetic and taxonomic diversity is expected to correlate with functional diversity, our observation of few shifts in the taxonomic membership of rare organisms indicates a possible functionally redundant role of the rare biosphere in the oral and GI tract. Further research will continue to explore the identities and roles of rare uncharacterized taxa in human and environmental samples. Notably, the Illumina sequencing method applied here resulted in a relatively low proportion of chimeric sequences within the data, consistent with previous observations<sup>25</sup>. This is not surprising considering the short length of the PCR amplicons and the absence of long stretches of highly conserved nucleotides. This finding emphasizes the usefulness of this method for deep-sequencing of 16S rRNA genes and removes the need to exclude a large portion of the data due to predicted chimeras.

The analysis of sequences across all samples demonstrates the quantitative strengths of large 16S rRNA gene datasets to characterize complex microbial communities (Fig. 6). However, although variable regions have high taxonomic resolution<sup>45</sup>, caution should accompany the interpretation of such targeted analyses because V3region sequences can represent closely related species, and thus will not, in some cases, be able to distinguish pathogenic from commensal members or, potentially, even closely related species within the same genus<sup>45</sup>. Similar concerns apply not only to our data, but also to any single-gene (or even phenotype-based) analyses of hostassociated microorganisms. Sequencing variable regions of the 16S



### 16S rRNA gene relative abundance (per 100,000 sequences)

Figure 6 | Abundance of V3 regions of 16S rRNA genes of targeted organisms within all samples. The entire sequence dataset was queried for type strains of *Streptococcus mutans*, *Treponema denticola*, *Clostridium difficile* and *Faecalibacterium prausnitzii*. For results from additional target organisms, see Table S6.

rRNA gene is one of many investigative techniques and thus requires additional complementary approaches to confirm observations.

We have generated a first baseline that improves our understanding of how human-associated bacteria change along the digestive system. This initial investigation into our internal biogeography is of particular importance because the oral cavity and GI tract constitute areas of intimate interactions between bacterial communities and human cells.

### **Methods**

Inclusion and exclusion criteria. Samples were collected from two men and two women. All subjects were healthy adults undergoing a routine colonoscopy and gastroscopy, for investigation of clinical symptoms or screening for colorectal cancer, at Mount Sinai Hospital (Toronto, Canada) due to clinical criteria that justified screening; i.e., age over 50, family history of cancer in first degree relatives or occult blood positive fecal testing. Exclusion criteria included new onset diarrhea gastrointestinal symptoms, any condition requiring the need for antibiotic medication prior to dental procedures, self-reported pregnancy, severe periodontal disease including but not limited to purulent exudates, generalized dental mobility and/or severe gum recession, active treatment of periodontitis within the previous six months, disease conditions that could be expected to interfere with examination procedures or the subject safely completing the study, presence of any dental caries open lesions, and use of systemic antibiotics within the past three months. For inclusion, subjects had no known gastrointestinal disease and had not undergone oral surgery in the previous year. Each subject had four clinically caries-free interproximal tooth sites, and no class III restorations prior to sampling. All sampling was conducted in accordance with relevant guidelines and regulations and research approved by the Research Ethics Boards of Mount Sinai Hospital and the University of Waterloo (ORE# 15605).

Sample collection. Each subject provided a stool sample prior to, and within 24 hours of, preparing for colonoscopy by Klean Prep. The stool sample was frozen at  $-20^{\circ}$ C until the time of endoscopy and the sample was stored at  $-80^{\circ}$ C until DNA extraction. Prior to gastroscopy and colonoscopy, samples of the oral biofilm were collected from supra-gingival plaque, sub-gingival plaque, and the surface of the tongue. Plaque samples were collected using a sterile curette and placed into 1 ml of sterile DNA-free Dulbecco's Phosphate Buffered Saline (D-PBS; Invitrogen). Supragingival samples were taken from caries-free interproximal sites between the maxillary lateral incisor and the maxillary cuspid incisor or the maxillary cuspid incisor and the first primary molar on the right (12/13 or 13/14) and left side (22/23 or 23/24) for each subject. Sub-gingival plaque was taken from periodontal pockets of the above-mentioned teeth. Teeth were isolated to minimize salivary contamination and two strokes of the curette were used per site in an attempt to standardize collection. Sampling of the tongue was done with a sterile stainless steel spatula with one midline scrape of the tongue only. The sample solutions were vortexed and stored at -80°C until DNA extraction. During colonoscopy and gastroscopy, biopsies of the transverse colon, sigmoid colon, rectum, gastric antrum, gastric body and of the duodenum were collected. Tissue samples were placed in 1 ml of sterile D-PBS as above, then rapidly frozen at -80°C until used for DNA extraction.

**DNA extraction.** For each site an individual replicate sample was thawed, then vortexed to disperse clumps (plaque samples) or dislodge mucosal attached cells (biopsy samples). Stool samples were thawed and homogenized by mixing prior to DNA extraction. Total genomic DNA was isolated from 500  $\mu$ l of the sample storage buffer (or from 0.25 g of feces) with the PowerSoil DNA isolation kit (Mo Bio, USA) according to the manufacturer's instructions with minor modifications, described below. Only supernatants from vortexed tissue biopsies were included in the DNA isolation in order to reduce the co-extraction of human DNA. Modifications to the DNA isolation kit protocol included the addition of a 40 sec bead-beating step (at speed 6.0 in a FastPrep homogenizer; MP Biomedicals, USA) and heating to 70°C for 10 min prior to binding of contaminants with kit reagents. Purified DNA was separated on a 1% agarose gel and quantified by densitometry of the gel image and

spectrophotometry (NanoDrop 1000; Thermo Scientific, USA) of the sample. Of the 48 samples collected, two were excluded due to low biomass and an inability to extract sufficient DNA for subsequent PCR amplification.

**PCR conditions and Illumina library construction.** Due to the low biomass of several samples, a nested PCR protocol was used to amplify the bacterial 16S rRNA gene from all samples. For the first round of amplification, the near full-length 16S rRNA gene was amplified using primers 27F and 1492R<sup>46</sup>. For Illumina library preparation, amplification of the V3 region used modified 341F and 518R primers<sup>47</sup> containing a six-base barcode, the Illumina adapter sequence and regions for binding of the sequencing primers<sup>22</sup>. Twenty-five cycles were used for the first PCR round and 20 cycles were used for the second round. One exception to this was the use of 30 cycles for gastric antrum and gastric body samples in the second PCR round. Forty-six pooled PCR amplicons were prepared as described previously<sup>22</sup> and added in equal ng amounts to be sequenced in two lanes of a Genome Analyzer IIx at the Plant Biotechnology Institute (National Research Council Canada; Saskatchewan, Canada).

Defined bacterial community. A defined microbial community was prepared in order to compare Illumina library sequencing to traditional Sanger sequencing. To prepare this community, genomic DNA from the following 12 bacterial strains was added in equivalent amounts with the exception of Staphylococcus, for which threefold more DNA was added: Pseudomonas aeruginosa (ATCC 10145), Escherichia coli (ATCC 11303), Klebsiella pneumoniae (Macdonald Campus of McGill culture collection), Alicaligenes faecalis (ATCC 8750), Enterobacter aerogenes (ATCC 13048), Lactobacillus plantarum (ATCC 8014), Bacillus subtilis (ATCC 6633), Enterococcus faecalis (ATCC 19433), Citrobacter freundii (ATCC 8090), Proteus vulgaris (ATCC 6380), Clostridia sporogenes (ATCC 19404), Staphylococcus epidermidis (ATCC 12228). The V3 region of the 16S rRNA gene was amplified as described above, in duplicate using two different barcodes, in order to evaluate library reproducibility. These additional two libraries were sequenced as part of a separate Illumina run containing additional environmental samples. Near full-length 16S rRNA genes from the same pool of DNA were amplified using 27F/1492R primers as described above and inserted into the TOPO cloning system (Invitrogen, Canada) then used to transform E. coli, as per kit instructions. Ninety-six positive clones were chosen and sequenced with conventional Sanger sequencing. All sequences were classified using the RDP classifier with the same conditions as below.

Data analysis. Illumina sequencing returned a total of 46,960,900 raw sequences across 46 treatments over two independent sequencing runs. Forward and reverse raw sequences were assembled and filtered, excluding those containing unknown (N) characters or a nucleotide mismatch within the assembly overlap. After assembly identical sequences within a treatment library were collapsed, maintaining sequence counts. Subsequently, primer regions were removed and sequences <100 nucleotides, corresponding to 23,709 100% identity groups, were deleted. A total of 8,344,920 groups of identical sequences, corresponding to 32,770,833 sequences were used in downstream analysis. All sequences were deposited in MG-RAST under the accession numbers 4471952.3–4471998.3.

Sequences were then clustered at a variety of percent identities using the CD-HIT<sup>24</sup> clustering algorithm. A sequence identity cutoff of 97% was used to identify OTUs and the results of the CD-HIT algorithm using this threshold was used in subsequent analysis. Clustered data were then evaluated for potential chimeric sequences using the fast implementation of UCHIME within the USEARCH package v.4.2.66<sup>48</sup> using default and modified parameters.

Taxonomy was assigned using the RDP-II classifier<sup>45</sup> and assignments were accepted if the bootstrap measure of classification reliability exceeded 0.5. Taxonomic bar charts were plotted using the ggplot2 package<sup>49</sup> implemented in the R statistical environment<sup>50</sup>.

Representative sequences from each cluster were aligned with the PyNAST aligner to the greengenes core set<sup>51</sup> in QIIME v 1.2.0<sup>52</sup>. A phylogeny was constructed within QIIME using FastTree<sup>53</sup>. Rarefaction curves, alpha diversity and beta diversity calculations were performed using QIIME and plotted independently. For rarefaction curves of Chaol species estimates, five sets of resampled data (without replacement) were used. Calculations for Chaol, phylogenetic diversity and Shannon diversity involved five rarefied subsets of 200,000 sequences from each sample. Supra-gingival plaque from Subject 1 was excluded from this analysis since it contained an unusually low number of sequences. Similarity and differences in community membership were calculated based on the phylogenetic information within each sample with both the unweighted uniFrac values were calculated with QIIME and plotted with FigTree v 1.3.1<sup>54</sup>. Jackknife values were calculated with 100 sets of 200,000-sequence rarefied tables (without replacement). Principal coordinate analysis (PCoA) of weighted and unweighted UniFrac were also calculated and plotted with QIIME.

To characterize the overlap of OTUs present among broad sampling regions (mouth, stomach/duodenum, colon and stool) and across subjects, Venn diagrams were constructed using the *gplots* package in R<sup>50</sup>. Singleton OTUs were removed from this analysis because they made up the majority of OTU clusters and were not shared between sites or subjects.

To demonstrate the utility of obtaining such a comprehensive sequence data set for determining the presence of organisms of interest, a non-redundant *blastn* database was constructed from our 16S rRNA sequences. Corresponding sequences from medically significant species (see Table S6) were then queried against the custom database. To ensure strict matches, a 99% identity threshold was used with no more

than a two-nucleotide deviation in length from the medically significant query sequence (Fig. 6).

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### Author contributions

JDN, DC, GMH, KC, HCT DBS and MBG contributed to the initial design of the research. JCS and MDJL conducted the experimental and bioinformatics analyses with guidance from GMH and JDN, HCT and MBG collected oral biofilm samples, KC conducted the colonoscopies and gastroscopies. JCS prepared the first draft of this publication and all authors contributed to the subsequent stages of manuscript preparation.

# Additional information

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

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