

Diet Versus Phylogeny: a Comparison of Gut Microbiota in Captive Colobine Monkey Species

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Abstract Both diet and host phylogeny shape the gut microbial community, and separating out the effects of these variables can be challenging. In this study, high-throughput sequencing was used to evaluate the impact of diet and phylogeny on the gut microbiota of nine colobine monkey species ($N = 64$ individuals). Colobines are leaf-eating monkeys that fare poorly in captivity—often exhibiting gastrointestinal (GI) problems. This study included eight Asian colobines (*Rhinopithecus brelichi*, *Rhinopithecus roxellana*, *Rhinopithecus bieti*, *Pygathrix nemaus*, *Nasalis larvatus*, *Trachypithecus francoisi*, *Trachypithecus auratus*, and *Trachypithecus vetulus*) and one African colobine (*Colobus guereza*). Monkeys were housed at five different captive institutes: Panxi Wildlife Rescue Center (Guizhou, China), Beijing Zoo, Beijing Zoo Breeding Center, Singapore Zoo, and Singapore Zoo Primate Conservation Breeding Center. Captive diets varied widely between institutions, but within

an institution, all colobine monkey species were fed nearly identical or identical diets. In addition, four monkey species were present at multiple captive institutes. This allowed us to parse the effects of diet and phylogeny in these captive colobines. Gut microbial communities clustered weakly by host species and strongly by diet, and overall, colobine phylogenetic relationships were not reflected in gut microbiota analyses. Core microbiota analyses also identified several key taxa—including microbes within the *Ruminococcaceae* and *Lachnospiraceae* families—that were shared by over 90% of the monkeys in this study. Microbial species within these families include many butyrate producers that are important for GI health. These results highlight the importance of diet in captive colobines.

Keywords Colobine · Gut microbiota · Diet · Phylogeny · Primate

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Introduction

The gut microbiota—a community of microbes living within the gastrointestinal tract—play an important role in both health and evolution of host species. On a broad scale, Ley et al. (2008a) examined the gut microbiota of 60 mammalian species and found more similar gut microbial composition in animals that were closely related taxonomically [1]. This study also found that animals with similar diets (i.e., herbivores, carnivores, omnivores) had more similar gut microbial communities. Host phylogeny influences the microbial community through immune-related genes that shape host-microbiota interactions and through vertical transmission of the microbiota [2–5]. Diet shapes the gut microbial community by providing substrates that differentially support or enhance the growth of specific microbes [6–8]. The gut microbiota can enable adaptation to new dietary niches [1]; thus, the effects of diet and host phylogeny are often intertwined, as dietary changes—which are mediated through gut microbes—can play a role in host speciation [9]. The effects of both host phylogeny and diet on the gut microbiota have been examined in multiple studies: In a few of these studies, similar diets appear to drive convergence of gut microbial communities between host species [10, 11]. In other studies (e.g., turtle ants, zebrafish, Oriental river prawn, great apes, New World leaf-nosed bats), host phylogeny appears to have a stronger impact on gut microbial community composition [12–16]. One complicating factor in many of these studies is that differing host species often have different diets and environments—either in captivity or in the wild—making it challenging to separate out the effects of phylogeny from diet.

In this study, we had the unique opportunity to parse effects of diet and phylogeny by examining gut microbiota of several closely related leaf-eating monkey species (subfamily Colobinae) that shared the same captive diets. Colobine monkeys are Old World monkeys that occur in Asia and Africa. They have evolved several specialized anatomical and physiological features that facilitate consumption of a cellulose- and lignin-rich diet. These foregut fermenting primates have significantly longer gastrointestinal (GI) tracts and larger stomach surface areas than other mammals—including other herbivorous primates [17]. Expansion of the gut increased retention time, and the highly sacculated forestomachs, also known as the saccus and presaccus, became the site for microbial fermentation [17, 18]. It has been suggested that these adaptations allowed colobines to shift their diet gradually from frugivory to folivory, reducing their competition with apes [17]. While colobine digestive anatomy has been well described [17, 19–21], less is known about the composition and diversity of the colobine gut microbial community and how it potentially evolved from handling a high sugar, low fiber diet (ripe fruit) to a low sugar, high fiber diet (mature leaves) [22–25]. Studying the gut microbiota of colobines can

provide insights into the evolution of folivory in these primates. This type of study is also important for another reason: colobines fare poorly in captivity and commonly exhibit GI problems (e.g., diarrhea, vomiting, bloat, etc.) [21, 25–29]. In the wild, colobines consume a variety of plants daily and seasonally. Captivity represents a rapid and dramatic change in diet and environment, which can significantly alter the gut microbiota and potentially have negative consequences on host health [30, 31].

For colobine phylogeny, we referred to the phylogenies constructed by Wang et al. [32] and Liedigk et al. [33]. These phylogenies are based on both mitochondrial and nuclear DNA sequences. While there is some controversy about the phylogenetic tree at the species level, there is a general consensus at the genus level: *Rhinopithecus* is most closely related to *Pygathrix* and *Nasalis* followed by *Trachypithecus*. *Colobus*, the African colobine, is the most distantly related (Fig. 1). We predicted that if diet plays a stronger role in gut microbiota composition than phylogeny does, or if diet overwhelms subtle microbial community differences between closely related host species, then gut microbial communities should be more similar in all colobine species consuming the same diet. Alternately, if primate phylogeny plays a stronger role in gut microbiota composition than diet, then gut microbial communities should be more similar in conspecific or congeneric monkeys that consume different diets.

Methods

Study Design

Our study examined gut microbiota in nine colobine species: eight Asian colobines (*Rhinopithecus brelichi*, *Rhinopithecus roxellana*, *Rhinopithecus bieti*, *Nasalis*

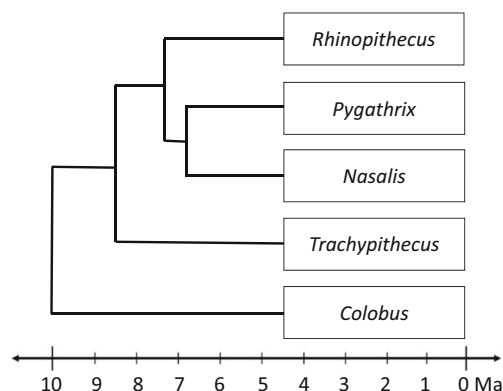


Fig. 1 Colobine phylogeny and divergence. Only colobine genera included in our study are featured in the phylogeny below. See [32] or [33] for more detailed colobine phylogenies. Ma = mega-annum or million years

larvatus, *Trachypithecus francoisi*, *Trachypithecus auratus*, *Trachypithecus vetulus*, *Pygathrix nemaeus*) and one African colobine (*Colobus guereza*). These colobines were housed at five captive institutes: Beijing Zoo (China), Beijing Zoo Breeding Center (China), Panxi Wildlife Rescue Center (China), Singapore Zoo (Singapore), and Singapore Zoo Primate Conservation Breeding Center (Singapore). Six species (*R. brelichi*, *R. roxellana*, *R. bieti*, *N. larvatus*, *P. nemaeus*, *T. auratus*) were sampled at multiple captive institutes. We also sampled multiple monkey species within each captive institute. Diets varied by captive institute; however, within an institute, diets for all colobine species were identical or nearly so, as assessed through observation and review of diet sheets (Table 1). Therefore, “captive institute” is used in this study as a proxy for diet.

Primate Fecal Collection and Processing

A total of 70 fecal samples were collected from 64 individuals during the summers of 2010, 2012, and 2013. All individuals at each captive institute had access to both indoor and outdoor enclosures that were cleaned daily. Monkeys at the Beijing Zoo, Panxi Wildlife Rescue Center, and Singapore Zoo additionally had access to natural space including trees and soil. Average temperature and humidity across locations and collections dates were relatively similar (Table S1). As available, age, sex, grouping, and wild/captive born status were recorded (Table S2). Dietary data was also recorded at each captive institute (Table 1).

All feces were processed on Flinders Technology Associates (FTA) cards as previously described [34, 35]. Briefly, a sterile cotton swab (Dynarex, Orangeburg, NY, USA) was inserted into the center of the feces, rotated, and withdrawn. The swab was then applied to an FTA card (Whatman Inc., Florham Park, NJ), which was air dried and then stored in a Ziploc bag at room temperature with MiniPax desiccant packets (Multisorb Technologies Inc., Buffalo, NY, USA). Samples were stored for up to 38 months prior to DNA extraction.

Earth Microbiome Project (EMP) protocols were followed for DNA extraction, amplification, and library preparation [36] with one alteration: Twenty punches were made in each FTA sample circle using a 2-mm Harris Uni-Core biopsy punch (TedPella, Redding, CA, USA). These 20 punches were then used as the starting material for DNA extraction with a PowerSoil DNA isolation kit (MoBio Laboratories, Carlsbad, CA, USA). Extraction was performed at Purdue University (West Lafayette, IN, USA) or the Zhejiang Institute of Microbiology in Hangzhou, China. The remainder of sample processing, sequencing, and core amplicon data analysis were performed by the Earth Microbiome Project (www.earthmicrobiome.org) at the BioFrontiers Institute Next-Generation Genomics Facility at

University of Colorado, Boulder, USA as previously described [34, 35]. All amplicon and metadata have been made public through the data portal (<https://qiita.ucsd.edu/>) [36]. Samples collected in 2010 and 2012 were paired-end sequenced on an Illumina HiSeq 2000. Samples collected in 2013 were paired-end sequenced on an Illumina MiSeq. MiSeq reads (150-base pair long) were trimmed to 100 base pairs to match HiSeq reads.

Microbial Taxonomic Assignment

16S amplicons were de-multiplexed, quality-filtered, and clustered using default parameters in Quantitative Insights Into Microbial Ecology (QIIME version 1.8.0), a software that facilitates microbial community analysis [37]. A total of 11.2 million reads (mean = 36,000; standard deviation = 9600) resulted after filtering. Sequences were grouped into operational taxonomic units (OTUs) at a sequence similarity of 97%. Sequences were then assigned to OTUs via open-reference picking. This was done through UCLUST in QIIME, which used the Greengenes reference dataset (version 13_8, release date August 2013 [38]) (<http://greengenes.secondgenome.com>). Representative OTU sequences were aligned to a Greengenes reference alignment [39]. De novo OTUs were classified using RDP classifier and the Greengenes reference set (version 13_8, release date August 2013) with a minimum 80% confidence threshold [40]. Samples were rarified at 15,029 reads.

Statistical Analyses

Observed OTUs, Shannon, Simpson, Chao1, and PD Whole Tree diversity indices were calculated in QIIME to compare gut microbial species richness between colobine species and genera. These values were then compared using ANOVA or Kruskal-Wallis tests with Tukey’s HSD or Dunn’s post hoc pairwise comparisons respectively in RStudio (version 0.99.465). In all diversity index analyses, two outliers were noted. One outlier, a nursing 3-month-old male infant *R. roxellana*, C008, had a very low gut microbial diversity. Human studies indicate that gut microbial diversity of nursing infants is low compared to adults but expands rapidly when solid food is added to the diet [41, 42]. C008 was removed from diversity index analyses because he was the only infant sampled in our study. Thus, his age and diet (primarily milk) were distinct from that of all other monkeys. The other outlier was a sub-adult female *R. brelichi*, G032, who had the lowest overall gut microbial diversity (4.1 standard deviations below the average) of any monkey we sampled. She was co-housed with two other *R. brelichi* that did not exhibit low gut microbial diversity. No other information is available regarding the health or history of G032 at the time of sampling. Because of the significant effect G032 had on some results, analyses are reported with and without this individual included.

Table 1 Diets by captive institute

Diets by captive institute	Beijing Zoo	Beijing Zoo Breeding Center	Panxi Wildlife Rescue Center	Singapore Zoo	Singapore Zoo Primate Conservation Breeding Center
Tree/leaf species	Mature leaves of mulberry (<i>Morus</i> species)	Greater number of tree/leaf species than Beijing Zoo due to proximity to the mountains	Mature leaves and bark of species in the following genera: <i>Prunus</i> , <i>Folium</i> , <i>Cornus</i> , <i>Buxus</i> , <i>Litsea</i> , <i>Ilex</i> , <i>Euonymus</i>	54 species from the following families: <i>Acanthaceae</i> , <i>Anacardiaceae</i> , <i>Arecaeae</i> , <i>Bignoniaceae</i> , <i>Caricaceae</i> , <i>Combretaceae</i> , <i>Dilleniaceae</i> , <i>Euphorbiaceae</i> , <i>Guttiferae</i> , <i>Lauraceae</i> , <i>Leguminosae</i> , <i>Malvaceae</i> , <i>Melastomataceae</i> , <i>Meliaceae</i> , <i>Moraceae</i> , <i>Moringaceae</i> , <i>Myrsinaceae</i> , <i>Myrtaceae</i> , <i>Musaceae</i> , <i>Oleaceae</i> , <i>Oxalidaceae</i> , <i>Poaceae</i> , <i>Polygonaceae</i> , <i>Rubiaceae</i> , <i>Rutaceae</i> , <i>Sapindaceae</i> , <i>Sapotaceae</i> , <i>Tiliaceae</i>	54 species from the following families: <i>Acanthaceae</i> , <i>Anacardiaceae</i> , <i>Arecaeae</i> , <i>Bignoniaceae</i> , <i>Caricaceae</i> , <i>Combretaceae</i> , <i>Dilleniaceae</i> , <i>Euphorbiaceae</i> , <i>Guttiferae</i> , <i>Lauraceae</i> , <i>Leguminosae</i> , <i>Malvaceae</i> , <i>Melastomataceae</i> , <i>Meliaceae</i> , <i>Moraceae</i> , <i>Moringaceae</i> , <i>Myrsinaceae</i> , <i>Myrtaceae</i> , <i>Musaceae</i> , <i>Oleaceae</i> , <i>Oxalidaceae</i> , <i>Poaceae</i> , <i>Polygonaceae</i> , <i>Rubiaceae</i> , <i>Rutaceae</i> , <i>Sapindaceae</i> , <i>Sapotaceae</i> , <i>Tiliaceae</i>
Fruits	Cantaloupe, dragon fruit, apple, banana, watermelon, peach, tomatoes, pear, honeydew	Unknown	Apples, plum, peach, pear, honeydew, cantaloupe, pumpkin	Apple, pear, mango, coconut, papaya, mangosteen, starfruit, guava, orange	Apple, pear, mango, coconut, papaya, mangosteen, starfruit, guava, tomato, dragon fruit
Vegetables	Carrot, radish, kang kong, cucumbers, corn, lettuce, sweet potato	Unknown	Cabbage, bok choy, carrot, eggplant, cucumber, sweet potato, radish, daikon, celery	Corn, long beans, carrots, sweet potato, kang kong, French beans	Sweet potato, cucumber, corn, long bean, carrot
Other	Steamed corn meal cake (contains 50% corn, 15% barley, 16% soybean meal, 10% bran, 2% calcium carbonate, 1% calcium hydrogen phosphate, 1% salt, 5% sugar); cooked egg; peanuts; cooked beef strips; biscuits	Unknown	Steamed corn meal cake with (contains 50% corn, 15% barley, 16% soybean meal, 10% bran, 2% calcium carbonate, 1% calcium hydrogen phosphate, 1% salt, 5% sugar), peanuts	Rice ball, bread with Nutroplex (vitamins), sun flower seeds, cooked meat	Mazuri primate pellet, cooked egg, chicken, rice ball, bread with Nutroplex (vitamins)

Each captive institute varied in diets and feeding schedules of colobine monkeys. Fruits and vegetables varied by season and availability

Microbial composition of each sample was assessed at various taxonomic levels (phylum through genus) using QIIME. A core microbiota analysis was also run in QIIME to identify OTUs (bacterial taxa) present in >90% of the samples included in this study. The goal of this analysis is to identify taxa that may be shared across host species potentially due to the importance of these taxa in association with host evolution and dietary choices.

Beta diversity was assessed using UniFrac distances within QIIME [43]. UniFrac distances are measured as the distances between microbial communities accounting for phylogenetic relationships between microbes. Principal coordinate analysis (PCoA) and Unweighted Pair Group Method with Arithmetic mean (UPGMA) allowed visualization of UniFrac distance patterns. Unweighted PCoA, which only accounts for the microbial species present, not their abundance, was used to determine if monkeys cluster by primate species or diet (i.e., captive institute).

Supervised learning analyses—also known as Random Forests—were performed in QIIME to determine if host phylogeny or diet could be used to differentiate samples based on microbial composition (OTUs) [44, 45]. This analysis was performed after filtering out all OTUs that were present in fewer than two samples. Twenty percent of the data were used as a test set, while 80% of the data were used as a training set. One thousand decision trees were generated based on groups (genera, diet) and microbial composition (OTUs.) Results from this analysis produced an error ratio. The error ratio is the error of random guessing over the error in the test sets summed. Finally, a PERMANOVA to test the effects of both host genera and diet was run in R Studio (version 0.99.465; vegan package, adonis function) [46].

Results

Differences in Microbial Diversity Associated with Phylogeny but Not Diet

Diversity indices were calculated for the microbial communities within each individual. Shannon, Simpson, PD Whole Tree, and observed OTU metrics all produced similar results (Figs. 2 and S1); thus, we chose to focus our analyses on the Shannon Diversity Index that accounts for both microbial richness and abundance. Chao1 results differed slightly (Fig. S1). When analyzing Shannon diversity by host species alone, *N. larvatus* had a significantly lower microbial diversity than all other species except *T. vetulus*, *R. bieti*, and *P. nemaus* (Table S3). At a genus level, *Nasalis* monkeys had significantly lower microbial diversity than all other genera except *Pygathrix* (Shannon without G032 ANOVA: $F_{4, 63} = 8.53$, $p < 0.0001$ —Fig. 2; Shannon with G032 Kruskal-Wallis: $p < 0.0001$; post hoc pairwise comparisons: *Nasalis-Colobus*

without G032: $p = 0.008$; with G032: Benjamini-Hochberg adjusted (BH): $p = 0.007$; *Nasalis-Rhinopithecus* without G032: $p < 0.0001$; with G032 BH: $p = 0.0003$; *Nasalis-Trachypithecus* without G032: $p = 0.0001$; with G032 BH adjusted: $p = 0.0003$).

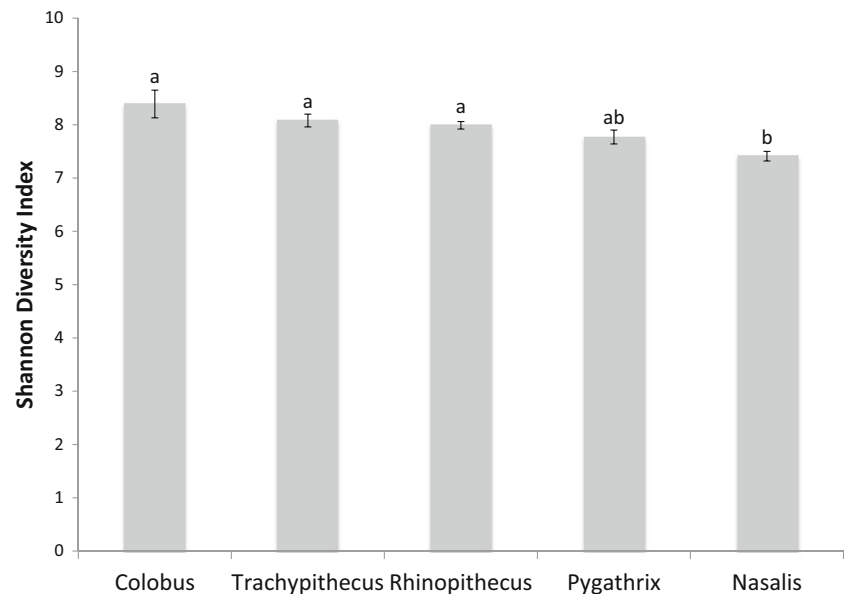
Shannon diversity indices for primate species that had two or more individuals housed at more than one captive institute were also analyzed by diet. One model was run for each host species with diet as the sole regressor. There were no significant differences in gut microbial diversity by diet (*N. larvatus*—Singapore Zoo versus Singapore Zoo Primate Conservation Breeding Center diet: $F_{1, 14} = 2.23$; $p = 0.16$; *R. roxellana*—Panxi Wildlife Rescue Center versus Beijing Zoo diet: $F_{1, 7} = 0.001$; $p = 0.97$; *R. bieti*—Beijing Zoo versus Beijing Zoo Breeding Center diet: $F_{1, 5} = 1.51$; $p = 0.27$; *R. brelichi*—Panxi Wildlife Rescue Center versus Beijing Zoo diet: $F_{1, 8} = 2.24$; $p = 0.17$). When primate species and diet were combined in an ANOVA with collection year included as a random effect, species but not diet was a significant predictor of Shannon diversity (species: $F_{8, 53} = 5.25$, $p < 0.0001$; diet/captive institute: $F_{3, 53} = 2.67$, $p = 0.058$). The interaction term between species and diet was not significant ($F_{3, 53} = 0.71$, $p = 0.55$).

Microbial Composition Varied by Phylogeny and Diet

A core microbiota analysis found that the colobine monkeys we sampled share many of the same gut bacterial taxa (Table 2). One hundred percent of the monkeys sampled shared two OTUs (roughly equivalent to bacterial species) in the phylum *Firmicutes*, order *Clostridiales*. Ninety percent of the monkeys sampled shared a total of 38 OTUs, 27 of which were in the phylum *Firmicutes*. Common families of these shared *Firmicutes* OTUs include *Lachnospiraceae* and *Ruminococcaceae*.

A PCoA based on unweighted beta diversity values indicated that gut microbial communities cluster weakly by primate species (Fig. 3a), moderately by primate genus (Fig. 3b), and strongly by diet (Fig. 3c). For all Principal Coordinate Analyses, PC1 accounted for 8% of the variation and samples along this axis separated roughly by country of sampling, with samples collected in China clustering separately from those collected in Singapore. PC2 accounted for 6% of the variation and samples along this axis separated roughly by captive institute within China (Beijing Zoo, Beijing Zoo Breeding Center, Panxi Wildlife Rescue Center) or within Singapore (Singapore Zoo, Singapore Zoo Primate Conservation Breeding Center). A UPGMA based on unweighted UniFrac distances also indicated clustering of gut microbial communities by primate genus and diet (Fig. 4). The left side of the figure, labeled by primate genera, shows that while there is clustering evident by genera, there were also some clusters (e.g., the *Trachypithecus*, *Colobus*, *Rhinopithecus* cluster in

Fig. 2 Shannon diversity index values by primate genera. C008, the *R. roxellana* infant outlier, and G032, the sub-adult *R. brelichi*, were removed prior to calculating these results. Genera marked with the same letter do not differ significantly in post hoc pairwise comparisons



the center) that could only be explained by diet. All five of the monkeys in this central cluster were housed at the Beijing Zoo Breeding Center and received the same diet.

Two *R. roxellana* individuals separated out from the *R. roxellana* cluster in both PCoA and UPGMA analyses (Figs. 3a–c and 4). One of these individuals was C008 (the nursing infant). The second individual, C005, was a singly housed sub-adult female. No information is known about the health of C005; although, it is possible that stress (from being housed singly) could have had altered her gut microbiota [47, 48].

Supervised learning and PERMANOVA analyses indicated that diet had a stronger effect on microbial composition than primate phylogeny. Supervised learning analysis by primate species yielded an error ratio (error of random guessing over the sum of the error in the test sets) of 3.7. In contrast, analysis by diet produced an error ratio of 6.2. Error ratios greater than 2 indicate a significant difference among groups; higher error ratios indicate greater differences. When host species and diet were combined in a PERMANOVA analysis, diet had a significant effect while species had only a marginally significant effect on microbial composition (diet: pseudo- $F = 1.17$, $R^2 = 0.067$, $p = 0.016$; host species: pseudo- $F = 1.09$, $R^2 = 0.124$, $p = 0.053$). The diet/species interaction was not significant (diet: pseudo- $F = 0.926$, $R^2 = 0.04$, $p = 0.865$).

Discussion

Our results revealed that both diet and host phylogeny shape the gut microbiota in colobine monkeys. This finding is not unique to colobines (ants [49]; Antarctic seals, [50];

myrmecophages [10]; woodrats [51]; fish [52]; hominids [12]; bees, wasps, beetles, termites [53]). In our study, clear patterns of microbial composition emerged based on diet and primate genus. Microbial diversity played a lesser role in these patterns. Additionally, diet had a stronger influence on the gut microbial community than host phylogeny did—potentially because hosts were so closely related phylogenetically that there may have been few differences in their gut microbiota.

Microbial Diversity

All colobine genera except *Pygathrix* had significantly greater gut microbial diversity than *Nasalis*. Interestingly, *Pygathrix* and *Nasalis* are the most closely related genera phylogenetically and in the wild, *Colobus*, *Trachypithecus*, and *Rhinopithecus*, all tend to consume higher proportions of leaves—and particularly mature leaves—than *Nasalis* and *Pygathrix* (Table 3). In general, mature leaves contain higher amounts of cellulose, lignin, and tannins [66, 67] and lower amounts of protein than young leaves [68]. As a result, mature leaves are more difficult to digest than young leaves, and microbial fermentation may play an even more important role in primate species that consume higher proportions of mature leaves in their diet. Perhaps historically, the *Colobus*, *Trachypithecus*, and *Rhinopithecus* gut microbial communities expanded in diversity to increase their fermentative capacity, while *Nasalis* and *Pygathrix*, with their lower consumption of mature leaves, did not require a “fermentation boost.” Higher fiber consumption [69], and notably in wild colobine monkeys as compared captive colobine monkeys [30, 31], has been linked with increased microbial diversity in multiple recent studies. Unique behavioral physiology of *Nasalis* monkeys may also contribute to their microbial dynamics: *Nasalis*

Table 2 Core OTUs—OTUs present in $\geq 90\%$ of the samples

Number of OTUs	Bacterial taxa (OTU)	% of samples in which OTU is present ($n = 70$ samples)
2	Phylum <i>Firmicutes</i> , Order <i>Clostridiales</i>	100
4	Unclassified Bacteria	98
1	Phylum <i>Firmicutes</i> , Class <i>Clostridia</i>	98
1	Phylum <i>Firmicutes</i> , Genus <i>Oscillospira</i>	98
1	Phylum <i>Firmicutes</i> , Family <i>Ruminococcaceae</i>	98
1	Phylum <i>Firmicutes</i> , Genus <i>Roseburia</i>	98
1	Phylum <i>Firmicutes</i> , Family <i>Ruminococcaceae</i>	96
1	Phylum <i>Firmicutes</i> , Order <i>Clostridiales</i>	96
1	Phylum <i>Firmicutes</i> , Genus <i>Faecalibacterium</i>	96
4	Phylum <i>Firmicutes</i> , Family <i>Lachnospiraceae</i>	94
1	Phylum <i>Firmicutes</i> , Genus <i>Oscillospira</i>	94
1	Unclassified Bacteria	94
2	Phylum <i>Firmicutes</i> , Genus <i>Oscillospira</i>	92
1	Phylum <i>Firmicutes</i> , Family <i>Lachnospiraceae</i>	92
1	Phylum <i>Firmicutes</i> , Order <i>Clostridiales</i>	92
1	Phylum <i>Firmicutes</i>	92
1	Unclassified Bacteria	92
3	Phylum <i>Firmicutes</i> , Family <i>Lachnospiraceae</i>	90
3	Unclassified Bacteria	90
2	Phylum <i>Firmicutes</i> , Genus <i>Dorea</i>	90
1	Phylum <i>Firmicutes</i> , Order <i>Clostridiales</i>	90
1	Phylum <i>Firmicutes</i> , Genus <i>Blautia</i>	90
1	Phylum <i>Firmicutes</i>	90
1	Phylum <i>Bacteroidetes</i> , Family <i>Paraprevotellaceae</i>	90
1	Phylum <i>Bacteroidetes</i> , Genus <i>Prevotella</i>	90

monkeys are the only colobines in which facultative mercurism (rumination) has been reported [70, 71]. Regurgitation and remastication could potentially impact *Nasalis* gut microbial diversity by exposing forestomach ingesta and microbes to varying pH, oxygen, and nutrient conditions that reduce microbial diversity [72].

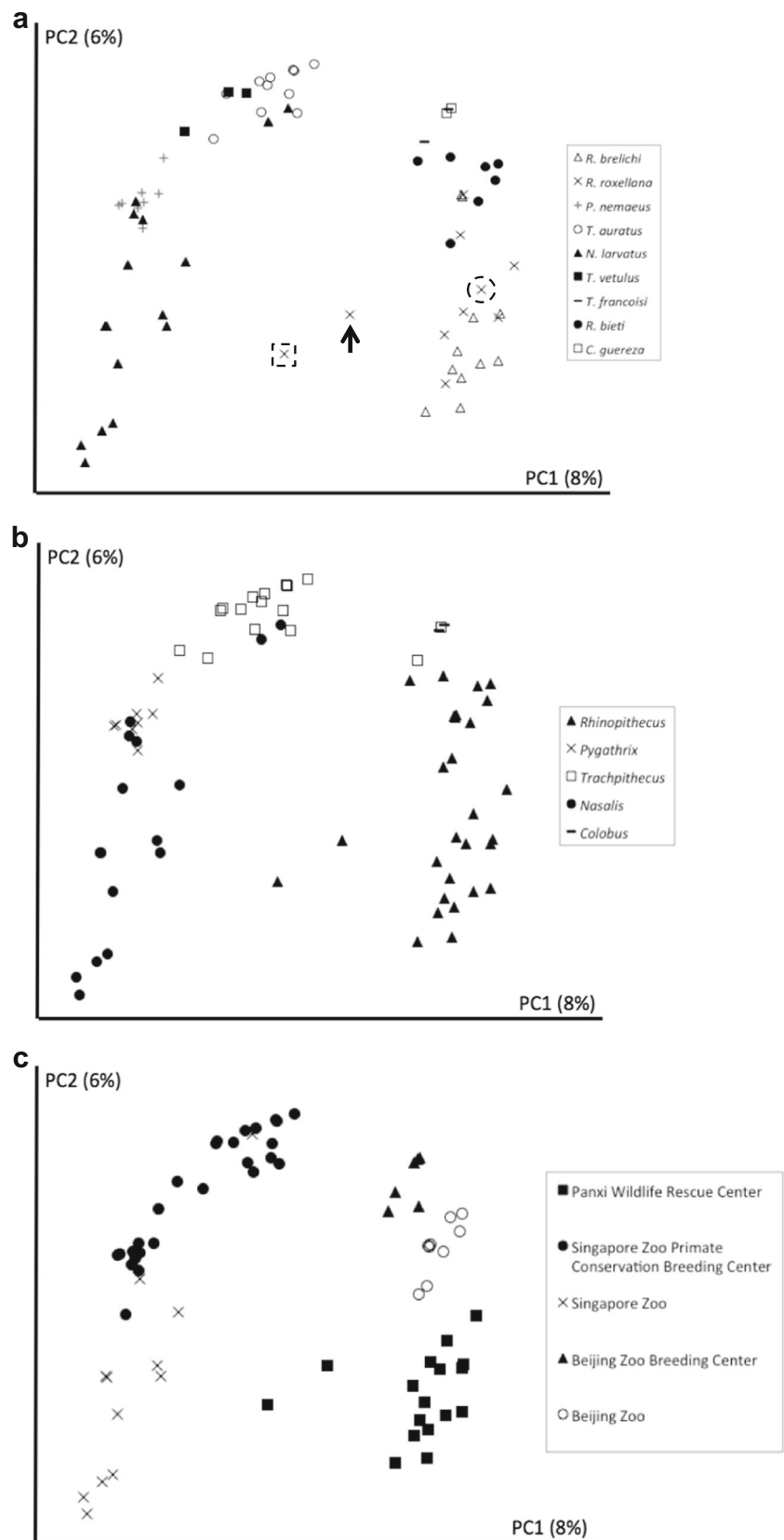
There were no significant differences in Shannon diversity indices as a function of diet (captive institute) within a primate species. This may have been due to small sample size. A power analysis (G*Power, version 3.1.5.1) indicated that the following sample sizes would have been necessary to detect significant differences based on diet: *N. larvatus*—41 monkeys at each captive institute; *R. bieti*—43 monkeys at each institute; *R. brelichi*—22 monkeys at each institute; and *R. roxellana*—130 monkeys at each institute. Our actual sample sizes were as follows: *N. larvatus*—16 monkeys total; *R. bieti*—7 monkeys total; *R. brelichi*—8 monkeys total; and *R. roxellana*—7 monkeys. Alternatively, diet may affect composition but not diversity of the gut microbiota. In a study on obesity, humans exhibited no change in microbial diversity but a dramatic change in gut microbial species composition before and after diet therapy [73]. Similarly, horses subjected

to two different diets (high-energy forage versus forage-concentrate) differed in gut microbial species composition but not diversity [74]. Different but not fewer microbial species may thrive in the presence of different dietary substrates, and even if we had had larger sample sizes, we may still have made the same observation that, within a host species, microbial diversity did not differ across diets.

Microbial Composition

Our study identified a colobine “core microbiota” or a group of bacteria shared by captive colobine hosts. Because colobines are leaf-eating monkeys with similar digestive physiology, they might be expected to share microbes associated with the digestion of cellulose. That is, in fact, what we found. Most of the shared taxa were in the *Lachnospiraceae* and *Ruminococcaceae* families, including several OTUs in the genus *Oscillospira* (family *Ruminococcaceae*). *Oscillospira* species are found on leaf and grass cuticles within the gut of ruminants [75]. Notably, these bacteria are not found on leaves or grass in nature [75, 76]; rather, they are gut microbes adapted to living on and degrading leaves in the GI tract.

Fig. 3 Principal Coordinate Analysis (PCoA) on unweighted UniFrac distances between **a** colobine species, **b** colobine genera, and **c** diets based on captive institute. Unweighted UniFrac distances account for microbial species richness but not evenness. In **a**, *arrow* indicates a 3-month-old *R. roxellana* infant (C008) that was still nursing at the time of sample collection. The *dashed square* indicates a juvenile female *R. roxellana*, C005, who was housed singly. This sample was collected in 2010. The *dashed circle* indicates the same individual (C005) sampled in 2013, at which time she was co-housed with a large family group



Microbes within the *Ruminococcaceae* and *Lachnospiraceae* families have been reported in wild folivorous primates, and one study by Amato et al. [77] suggests that the changing abundances of these microbes seasonally are linked to increases and decreases in dietary energy consumption. Bacterial species within the *Ruminococcaceae* and *Lachnospiraceae* families also contain enzymes, transport mechanisms, and metabolic pathways that enable degradation of complex plant material, such as cellulose, hemicellulose, and lignin [78]. Many of these species also produce butyrate as a metabolic product of fiber degradation [79]. Butyrate is a

short chain fatty acid (SCFA) critical to colonocyte health and immune defense [80, 81]. Butyrate also has anti-inflammatory properties and has been reported to alleviate obesity and the risk metabolic disease [82, 83]—both of which are growing concerns in captive populations. Inflammatory GI diseases have an inverse relationship with the abundance of bacterial species in the *Lachnospiraceae* [84] and *Ruminococcaceae* families [85]. The core microbiota emphasized the broad dietary similarities between leaf-eating monkeys and the co-evolution of gut microbes within colobines. The core also highlighted taxa (*Ruminococcaceae* and *Lachnospiraceae*)

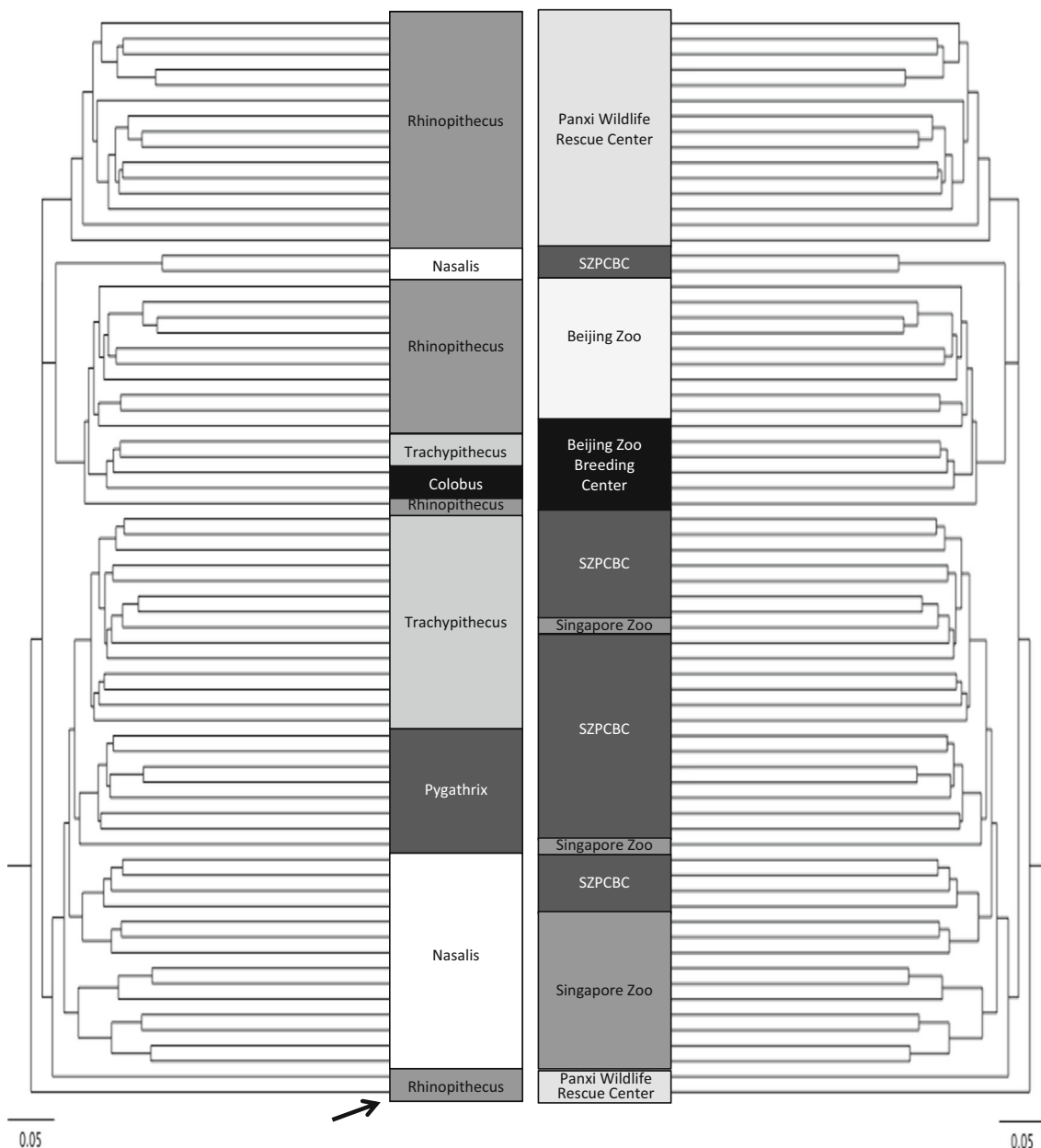


Fig. 4 Unweighted Pair Group Method with Arithmetic mean (UPGMA) using unweighted UniFrac distances. On the *left*, samples are identified by primate genera. On the *right*, the same samples are

identified by diet. *Arrow* indicates *R. roxellana* individuals C008 and C005. (Note: Captive institute is used a proxy for diet). SZPCBC Singapore Zoo Primate Conservation Breeding Center

Table 3 Proportion of leaves consumed in wild diets of several colobine genera

Genera	Proportion leaves in wild diet	Proportion mature leaves in wild diet	References
<i>Rhinopithecus</i>	93%	82% (varies seasonally, can be as low as 0.6%)	[54–57]
<i>Trachypithecus</i>	60%	40%	[17, 58]
<i>Colobus</i>	81%	13%	[17, 59, 60]
<i>Pygathrix</i>	82%	9%	[61–64]
<i>Nasalis</i>	73% (some reports indicate <50%)	3%	[17, 58, 65]

that may play an important role in colobine health. Altered abundances or reductions in these taxa could be contributing to captive colobine GI problems. Given the strong effect we observed of diet on the colobine gut microbial community, dietary modifications may be a promising way to improve captive colobine GI health. Future work comparing the gut microbial communities of wild and captive colobines as well as healthy and unhealthy colobines is needed to further assess the potential role of the gut microbiota and the core taxa in colobine health.

Microbial diversity and core microbiota analyses provided some support for our prediction based on primate phylogeny. Notably, the fact that primate phylogeny produced a signal—albeit not strong—across different regions and climates and despite different diets indicates that host evolution does indeed play a role in shaping the microbial community. However, overall, host phylogeny was a weaker predictor of gut microbial composition. Diet, on the other hand, was a stronger predictor of gut microbiota. PCoA, UPGMA, PERMANOVA, and supervised learning analyses supported our prediction based on diet: gut microbial communities were more similar in colobine species consuming the same diet. PCoA and UPGMA analyses demonstrated moderate clustering of samples by primate species and genera but strong clustering of samples by diet. Muegge et al. (2011) came to a similar conclusion while examining the effect of diet and host phylogeny on the gut microbiota of 33 mammalian species. Animals clustered by diet (herbivores, omnivores, and carnivores), but the gut microbiota did not reflect mammalian phylogeny. For example, colobus monkeys clustered with other herbivores like sheep and kangaroos, rather than with other primates such as chimpanzees or baboons, which are omnivores [11].

Similarly, in our study, colobine phylogeny was not reflected in our gut microbial analyses. The African colobine (*Colobus*) was the outgroup relative to the Asian colobines (*Rhinopithecus*, *Trachypithecus*, *Pygathrix*, *Nasalis*). African and Asian colobines diverged approximately 10 million years ago, and all subsequent divergences within the Asian colobine clade occurred more recently [86]. However, the *Colobus* samples did not diverge from the Asian colobines in PCoA clusters or in UPGMA branching. There are several possible explanations for this: (1) a long-term captive diet overwhelmed subtle

or previous differences in *Colobus* gut microbiota or (2) folivory in primates is thought to have evolved from frugivory [17, 20]. If the common ancestor to both African and Asian colobines was frugivorous, then folivory may have evolved independently in both sets of colobines. Convergence would then explain similarities in gut microbial composition between African and Asian colobines. A recent study on distantly related myrmecophages (ant and termite eating mammals; e.g., anteaters, aardvarks, aardwolves) found convergence of the gut microbiota due to highly similar diets [10]. A similar result was found in a study of 283 ant species: distantly related herbivorous ant species shared more similar gut microbial communities with each other than they did with more closely related carnivorous ants [87]. In these cases, gradual diet change due to competition or changing resources for the host probably altered the gut microbial environment. In turn, the gut microbial community changed. Similarly, both African and Asian colobines may have begun eating unripe fruits, seeds, and young leaves in order to avoid competition with frugivores [20]. Colobine gut microbiota may have then adapted to this dietary change, and microbes that processed sugar were outcompeted by microbes that processed secondary compounds found in seeds and leaves. This, in turn, may have primed the colobine digestive system to degrade cellulose, hemicellulose, and lignin; thus, colobines could begin consuming mature leaves [20].

PERMANOVA and supervised learning analyses provided additional support for our prediction based on diet. Although error ratios were greater than 2 for analysis by diet and primate species, samples classified by diet had a higher error ratio (indicating lower classification error) than samples classified by primate species. Additionally, only diet was significant by PERMANOVA. These results, taken together, illustrate that the colobine gut microbial community is shaped by multiple factors. Diet played a large role in gut microbial composition, but host phylogeny could not be discounted. Another example of the interplay between diet and phylogeny comes from a controlled study on rodents: two closely related species of woodrats were captured from the wild and brought into captivity [51]. Both species were maintained under identical conditions and fed an identical diet. After 6 months, both species still had distinct gut microbial communities, and both retained over 50% of the OTUs they had as wild rodents [51]. In other words, ~50% of their gut microbiota was altered by captivity and a

captive diet. The other ~50% was unaffected by the new environment and retained a likeness to their wild conspecifics, potentially due to host phylogeny or host genetics.

In our study, we used captive institute as a proxy for diet. We report the diets offered at each institute, but notably, diet offered may vary from the diet consumed and we did not track this information. Additionally, there are other features of captive institutes that could potentially contribute to the differences we observed in our study. For example, soil, air, or water microbes may differ between China and Singapore or between locations within China and Singapore. There may be different husbandry or sanitation practices at each institute that result in varying microbial exposures to the monkeys. And frequent visitors or tourists at some of the captive institutes may create stressors or increased potential for bacterial transmission from humans. Some studies suggest that free living or environmental sources of bacteria contribute little to the overall gut microbial community [50, 51], but we cannot rule this out as a possibility.

Conclusions

Our study highlights the importance of diet in shaping captive colobine gut microbiota. Differences in microbial diversity between *Nasalis* monkeys and other colobine genera and the presence of a core microbiota suggest the influence of host phylogeny on the gut microbiota. UPGMA, PCoA, PERMANOVA, and supervised learning analyses indicate the strong effect of diet on colobine gut flora. While we cannot change colobine phylogeny, we can certainly alter captive colobine diet in attempt to improve the GI health of these endangered primate species. This study provides a foundation for further work on colobine gut microbiota and for improving captive diets with both host and microbiota in mind.

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