

Stable and transient structural variation in lemur vaginal, labial, and axillary microbiomes: Patterns by species, body site, ovarian hormones, and forest access

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**Abstract** (200w limit): Host-associated microbiomes shape and are shaped by myriad processes that ultimately delineate their symbiotic functions. Whereas a host's stable traits, such as its lineage, relate to gross aspects of its microbiome structure, transient factors, such as its varying physiological state, relate to shorter-term, structural variation. Our understanding of these relationships in primates derives principally from anthropoid studies and would benefit from a broader, comparative perspective. We thus examined the vaginal, labial, and axillary microbiota of captive, female ring-tailed lemurs (*Lemur catta*) and Coquerel's sifakas (*Propithecus coquereli*), across an ovarian cycle, to better understand their relation to stable (e.g. species identity/mating system, body site) and transient (e.g. ovarian hormone concentration, forest access) host features. We used 16S amplicon sequencing to determine microbial

composition and enzyme-linked immunosorbent assays to measure serum hormone concentrations. We found marked variation in microbiota diversity and community composition between lemur species and their body sites. Across both host species, microbial diversity was significantly correlated with ovarian hormone concentrations; negatively with progesterone and positively with estradiol. The hosts' differential forest access related to the diversity of environmental microbes, particularly in axillary microbiomes. Such transient endogenous and exogenous modulators have potential implications for host reproductive health and behavioral ecology.

**Keywords:** strepsirrhine, mating system, progesterone, estradiol, environment

## Introduction

Various microbial communities occupy the epithelial surfaces of vertebrate hosts and interact with their physiological systems to mediate host health (Belkaid and Segre 2014; Sharon *et al.* 2016; Gilbert *et al.* 2018; Benavidez *et al.* 2019) and reproductive success (Reid *et al.* 2015; Power, Quaglieri and Schulkin 2017). For example, human vaginal microbiomes mediate pathogen acquisition and immune response to foreign cells, including sperm (Taha *et al.* 1998; Yarbrough, Winkle and Herbst-Kralovetz 2014). External epithelial communities, such as the labial and axillary microbiomes, promote host health and reproduction, respectively, through pathogen resistance or wound healing (Grice 2014; Misic, Gardner and Grice 2014) and through the manufacture of bodily odors used to chemically communicate mate quality (Sharon *et al.* 2010; Ezenwa and Williams 2014). The range and specificity of functions served by microbes owe to differences in their community structure across body sites (Huttenhower *et al.* 2012; Schommer and Gallo 2013). Over evolutionary time, host phylogeny largely predicts microbiome structure (Ley *et al.* 2008; Groussin *et al.* 2017; Nishida and Ochman 2018), whereas over shallower time scales, microbiome structure can reflect more transient characteristics, such as the host's physiology or

environmental condition (Phillips *et al.* 2012; Nieuwdorp *et al.* 2014; Greene *et al.* 2019). Here, we compare three microbiomes in the captive females of two lemur species to examine the relative contributions of stable (i.e., species identity or mating system and body site) and transient (i.e., ovarian hormone concentrations and forest access) factors in predicting microbial community structure.

Phylogeny is one of the strongest signals of microbiome structure and function at different body sites (Phillips *et al.* 2012; Council *et al.* 2016). In various mammalian lineages, skin microbiomes are structurally distinct between host species and show patterns of ‘phylosymbiosis,’ whereby the relatedness of skin microbes recapitulates the hosts’ phylogenetic relationships (Brooks *et al.* 2016; Ross *et al.* 2018). Thus, well-established patterns in humans (Grice *et al.* 2009; Peterson *et al.* 2009; Huttenhower *et al.* 2012) may not generalize to other primates (Yildirim *et al.* 2014; Davenport *et al.* 2017). Indeed, within closely related primate species, microbial community structures differ significantly between species at specific body sites (vaginal: Spear *et al.* 2010; Stumpf *et al.* 2010; Rivera *et al.* 2011; axillary: Council *et al.* 2016; forearm: Verhulst *et al.* 2018), presumably reflecting species- and site-specific functions. Notably, the diversity of scent-producing epithelial microbiota (e.g. the axilla, external genitalia, and scent glands) have long been thought to underlie host olfactory communication by contributing to the complex array of volatile organic compounds (VOCs) that emanate from different body sites (Gorman, Nedwell and Smith 1974; Albone and Perry 1976). Minimally, therefore, one would expect a positive relationship between odor-producing bacteria and scent-producing microbiomes.

In conjunction with phylogeny and functional morphology, the socioecological characteristics of hosts, such as their type of mating system, also mediate abundances of commensal and pathogenic microbes (Kokko *et al.* 2002; Sharon *et al.* 2010). For instance, species characterized by promiscuity or diverse network of social connectivity (i.e., numbers of unique sexual partners) show increased vaginal microbial diversity (MacManes 2011; Yildirim *et al.* 2014; Kenyon, Delva, & Brotman, 2019), presumably because sexual contact is a vector for sharing microbes between individuals. Furthermore, because sexually transmitted infections (STIs) follows similar networks (Doherty *et al.*, 2005; Liljeros,

Edling, & Amaral, 2003), greater microbial diversity in promiscuous species enhances immune function and disease prevention and, ultimately, reproductive success (Thrall, Antonovics and Dobson 2000; Nunn *et al.* 2014).

By comparison with these ‘stable’ factors, transient factors influence microbial communities over more proximate timescales. Transient factors endogenous to the host, such as changes in steroid hormone concentrations, alter microbial membership across body sites and sexes, with potential reproductive or health consequences. For example, progesterone (P<sub>4</sub>) positively correlates with abundances of gingival pathogens in human oral microbiomes in both sexes (Kornman and Loesche 1982; Nakagawa *et al.* 1994). In women, changes in vaginal microbiota accompany variation in estradiol (E<sub>2</sub>) concentrations during ovarian cycles (Mishell Jr *et al.* 1971), pregnancy (Loriaux *et al.* 1972), and menopause (Sherman, West and Korenman 1976; Rothman *et al.* 2011). Indeed, the dominance of *Lactobacillus*, which mediates susceptibility to bacterial vaginosis and HIV, is regulated, in part, by E<sub>2</sub> (Redondo-Lopez, Cook and Sobel 1990; Miller *et al.* 2016). Although vaginal microbiota vary across the ovarian cycles of certain anthropoids (Narushima *et al.* 1997; Miller *et al.* 2017), the roles of P<sub>4</sub> and E<sub>2</sub> in structuring the microbiomes of nonhuman hosts remain largely unexplored.

Transient factors exogenous to the host, such as varying contact with environmental microbes, are also known to impact microbiome structure across host taxa (Lax *et al.* 2014; Walke *et al.* 2014; Council *et al.* 2016; Hyde *et al.* 2016). Although the transmission of pathogenic, environmental microbes can negatively impact host health (Jones *et al.* 2008; Finley *et al.* 2013), the transfer of nonpathogenic, environmental microbes can bolster the diversity and function of commensal microbiomes (Hyde *et al.* 2016). Consistent to prior themes, there has been relatively little attention given to environmental microbes.

In the current study, we describe the vaginal, labial, and axillary microbiota of two strepsirrhine primates – the ring-tailed lemur (*Lemur catta*) and the Coquerel’s sifaka (*Propithecus coquereli*).

Although understudied relative to anthropoid primates, strepsirrhines are exceptionally diverse ecologically, morphologically, behaviorally, physiologically, and chemically (Martin 1972; Drea 2019), making them ideal subjects for the study of microbial contributions to host health and behavior. Whereas the ring-tailed lemur is primarily terrestrial, lives in multi-male, multi-female groups and mates promiscuously, the arboreal Coquerel's sifaka lives in smaller, family groups, and forms relatively stable pair bonds, although opportunities exist for occasional extra-pair mating. The females of both species differentially rely on labial scent marking relative to urine marking to communicate socio-reproductive information (Hayes, Morelli and Wright 2004; Scordato and Drea 2007; delBarco-Trillo *et al.* 2011; Greene and Drea 2014). Thus, while providing the opportunity to expand our understanding of host-microbe relationships across the primate order, these two host species also motivate distinct expectations about various stable and transient influences over microbial community structures.

More specifically, we expect the microbiomes of these species to reflect stable host traits and to differ structurally by species or mating system and body site. In particular, we expect the promiscuous ring-tailed lemur to harbor more diverse vaginal consortia than the pair-bonded sifaka. We also expect that, compared to vaginal microbiomes, the microbiomes of prominent scent-producing areas, the axilla and labia, will harbor more fermentative, odor-producing bacteria. With regard to transient traits, such as endogenous ovarian hormones, we expect aspects of microbiota richness and composition to vary with P<sub>4</sub> and/or E<sub>2</sub> concentrations. Lastly, with regard to exogenous influences, we expect the hosts' most distally located, labial and axillary microbiomes to harbor greater microbial diversity and abundance of environmental taxa than their more proximally located, vaginal microbiome, particularly when the captive hosts occupy outdoor (versus indoor) enclosures that allow greater contact with environmental microbes.

## Methods

### Subjects and housing

Our subjects were seven, adult, female lemurs ( $n = 3$  ring-tailed lemurs,  $n = 4$  Coquerel's sifakas), housed socially with conspecifics in different groups at the Duke Lemur Center (DLC; Durham, NC, USA). To avoid the potential confound introduced by pregnancy, the focal females were members of all-female groups or groups in which males were either immature or gonadectomized; they included all available, naturally cycling females at the DLC that, owing to housing constraints, would have no reproductive opportunities during the period of study.

In the Northern Hemisphere, the breeding seasons of captive ring-tailed lemurs and sifakas occur from October–February and July–October, respectively. Both species are polyestrous, with ring-tailed lemurs having up to three cycles within their breeding season (Evans & Goy 1968; Drea 2007) and Coquerel's sifakas having up to two cycles (Greene & Drea 2014; unpublished DLC records). The ovarian cycle of ring-tailed lemurs spans a 35- to 40-day period (Evans and Goy 1968; Bogart, Kumamoto and Lasley 1977; Van Horn and Resko 1977) with a receptivity period of up to 22 hours (Van Horn and Resko 1977), whereas the cycle of Coquerel's sifakas spans a 45- to 60-day period (Robert Schopler, pers. comm. 2018; in sister species *P. verreauxi*, Brockman *et al.* 1995), with a receptivity period of 0.5–96 hours (Brockman 1999).

All of the subjects had access to indoor and outdoor enclosures ( $146\text{ m}^2/\text{animal}$ ); a subset of the subjects ( $n = 1$  ring-tailed lemur,  $n = 2$  Coquerel's sifakas) also had access to multi-acre forest enclosures where they semi free-ranged, including with hetero-specific lemurs. Details on their diets, foraging, and

social behavior have been reported elsewhere (Starling *et al.* 2010; Greene *et al.* 2019). The subjects were maintained in accordance with the NIH Guide for the Care and Use of Laboratory Animals, and procedures were approved by the Institutional Animal Care and Use Committee of Duke University (protocol A111-16-05).

### **Study design**

Biological sampling, at each of three body sites, occurred repeatedly across one ovarian cycle during each species' peak breeding season. At four, equivalently spaced time points (i.e., every 11-13 days for ring-tailed lemurs and every 14-15 days for sifakas), we concurrently obtained epithelial/secretion and blood samples from the subjects, for microbial and endocrine analyses, respectively. We thus collected 28 microbial samples (7 subjects  $\times$  4 collections) per body site (or 84 microbial samples in total) and 28 blood samples. Because these females' cycles are asynchronous and would be sampled relatively infrequently, in addition to absolute hormone concentrations, we also used the natural log of the females'  $E_2$  to  $P_4$  ratios ( $\ln(E_2/P_4)$ ) across the sampling times as a means to align and visualize their cycles. Each female's greatest value of  $\ln(E_2/P_4)$ , approximating the periovulatory period, was assigned the 'standardized' time point 2 in Figure 5 below. In our results, in addition to assessing microbial patterns associated with individual steroid concentrations, we also examined how any patterns related to values of  $\ln(E_2/P_4)$ , a hormonal index of conception probability (Baird *et al.* 1991).

## Sample collection

We obtained our samples from awake, gently restrained animals that are habituated to collection procedures. Our handling of individually processed individuals occurred in the morning before the animals were fed (between 9:00am and 10:30am). First, within 5 minutes of each animal's capture, we collected 3 mL of whole blood from the femoral vessels (Drea 2007). To collect microbial samples, we used sterile, cotton-tipped swabs (pre-moistened with sterile water for samples taken from the genitals). We collected vaginal swabs from approximately 2-3 cm into the vaginal canal. We collected labial secretions by swabbing the external, labial folds on the right-hand side for 15 sec. For axillary samples, we rubbed the swabs against the skin of each animal's right axilla for 60 sec. We immediately placed the epithelial samples on ice and stored them in a – 80 °C freezer within 45-60 min of collection. After allowing the blood samples to clot at ambient temperatures for approximately 30-45 min, we centrifuged them (2200-2500 RPM for 15 min) and transferred the serum into sterile tubes for storage at – 80 °C.

## Microbial DNA extraction, sequencing and bioinformatics

Using the DNeasy Powersoil kit (QIAGEN, Frederick, MD), we extracted microbial gDNA from epithelial/secretion samples. To improve the DNA yield from these low-yield samples, we included additional incubation periods (1) after adding Solution C1 (10 min at 65 °C in a heat-block) and (2) after adding Solution C6 (prior to the final elution step, 10 min at room temperature). We quantified the extracted DNA using a Fluorometer (Qubit 4 with a broad-spectrum kit, Thermo Fisher Scientific, Waltham, MA) and shipped aliquots of extracted gDNA to the Argonne National Laboratory's

Environmental Sequencing facility (Lemont, IL) for library preparation and sequencing. There, the V4 region of the 16S rRNA gene (515F-806R) was amplified via polymerase chain reaction with region-specific primers adapted for the Illumina MiSeq platform (Caporaso *et al.* 2012). Forward primers contained a twelve-base barcode sequence to support pooling of samples in each flow cell lane. Once pooled, amplicon libraries were cleaned using AMPure XP Beads (Beckman Coulter, Pasadena, CA), and quantified using a fluorometer (Qubit 4). Amplicons were sequenced on a 151bp x 12bp x 151bp Illumina MiSeq run (Caporaso *et al.* 2012).

We analyzed the raw sequence data using a bioinformatics pipeline generated in QIIME2 (ver. 2019.2, Bolyen *et al.* 2019). We first joined paired-end sequences, demultiplexed, and discarded sequences that did not assign to a sample. Using the DADA2 plugin (q2-dada2, Callahan *et al.* 2016), we denoised, quality filtered, and removed phiX and chimeric sequences from the demultiplexed reads. Using the resulting sequences, we compiled a QIIME2 feature table, from which we discarded a single sample that had fewer than 10,000 assigned sequences. To generate a midpoint-rooted phylogenetic tree, we used the mafft program (Katoh *et al.* 2002) and fasttree2 (Price, Dehal and Arkin 2010) to perform a multiple-sequence alignment, remove highly variable sequence positions, and generate phylogenetic relationships. To assign taxonomy to our sequence features, we *de novo* trained the Naive Bayes classifier using the SILVA 132 database at 97% sequence similarity (ver. 132, Quast *et al.* 2012; Yarza *et al.* 2014) and tested the classifier using our representative sequences. We removed features classified as mitochondria or chloroplasts from downstream analyses.

We used the resulting taxonomy in combination with the feature table to calculate three metrics of alpha diversity (the logarithm of the number of observed operational taxonomic units, Shannon-Weaver, and Faith's phylogenetic diversity). Because all three metrics were highly, positively correlated ( $0.85 < r < 0.97$ ), we performed a principal components analysis on these metrics (prcomp {stats}, R ver. 3.6.1) and extracted the first principal component as a composite metric of alpha diversity. We created alpha rarefaction plots for each metric of alpha diversity and used the inflection points in the plots to determine

the cutoff of 10,000 reads per sample (above which, alpha diversity plateaued). To assess microbial composition, we calculated beta diversity using unweighted UniFrac, a metric that is well-suited to detect variation in communities with numerous rare taxa and those with distinct bacterial membership between groups. After calculating metrics of diversity, we combined features without assigned taxonomy below the Kingdom level into an “Unassigned”. We also included the conglomerate “Other” to visually represent the rare taxa that had relative abundances lower than 1%.

### **Enzyme-linked immunosorbent assays**

We measured the concentrations of P<sub>4</sub> and E<sub>2</sub> in serum samples using commercial, competitive enzyme immunoassay (EIA) kits (ALPCO diagnostics, Salem, NH, USA). The P<sub>4</sub> and E<sub>2</sub> assays have sensitivities of 0.1 ng/mL and 0.01 ng/mL, respectively. For P<sub>4</sub>, the inter-assay coefficients of variation (CVs) were 5.86% and 6.99% for low and high controls, respectively. The intra-assay CV, calculated as the mean CV of duplicate samples, averaged 6.12%. For E<sub>2</sub>, the inter-assay CVs were 7.47% and 13.27% for low and high controls, respectively, and the intra-assay CV averaged 4.83%. Concentrations of P<sub>4</sub> and E<sub>2</sub> are reported in pg/mL.

### **Statistical analyses**

To test for stable differences in alpha diversity across host species and body sites, we used Kruskall-Wallis tests with Dunn’s multiple comparison corrections in GraphPad’s Prism software (following Greene and McKenney 2018). To test for variation in microbial composition, or beta diversity, we used

permutational multivariate analyses of variance (PERMANOVAs; adonis{vegan} in R ver 3.6.1) on unweighted Unifrac distances (Lozupone & Knight, 2005; Lozupone *et al.*, 2011; following Amato *et al.* 2019). Our PERMANOVA was stratified by animal and included the following explanatory variables: species, body site, and their interaction, P<sub>4</sub>, E<sub>2</sub>, forest access, and body site nested within individual. To compare beta diversity between the body sites of each species, we implemented post-hoc tests of the PERMANOVA using the pairwiseAdonis package in R (Martinez-Arizu 2017). We analyzed within body-site variation for each species by calculating pairwise comparisons of beta diversity distances with Bonferroni-corrected student *t*-tests (QIIME, ver13.8; see Greene *et al.* 2019).

To test for transient relationships between microbial community structure, species identity, body sites, hormone concentrations, and forest access, we used linear mixed models (LMMs) in the lmer package of R. We first tested for relationships between hormone concentrations (of P<sub>4</sub> or E<sub>2</sub>, individually) and our composite measure of alpha diversity across the different microbial communities. In this first LMM (LMM1; Table 1), we included species, body site, and their interaction, forest access, P<sub>4</sub> and E<sub>2</sub> as fixed effects, with body site nested within individual included as a random effect. Our second LMM (LMM2), substituted ln(E<sub>2</sub>/P<sub>4</sub>) (i.e., our proxy of ovarian phase) for the individual hormone concentrations, but was otherwise identical to LMM1. To assess stable differences in alpha diversity across host species and body sites, we report the results of pairwise comparisons from our LMM1, adjusting *p*-values for multiple comparisons using Tukey's method.

We also report LMMs specifically predicting the relative abundances of two groups of bacterial taxa. The first bacterial group, determined *a priori*, consisted of five taxa identified in previous studies (typically focused on humans) as being associated with reproductive hormones at different body sites: Lactobacillales (Ferris *et al.* 2007; Jakobsson and Forsum 2007; Mirmomsef *et al.* 2014; Miller *et al.* 2016); *Streptococcus* (Cowley and Heiss 1991; Noguchi *et al.* 2004; Bezirtzoglou *et al.* 2008); *Bacteroides* (Larsen, Markovetz and Galask 1977; Kornman and Loesche 1982; Eschenbach *et al.* 2000; Bezirtzoglou *et al.* 2008); *Prevotella*, (Nakagawa *et al.* 1994; Kumar 2013; Miller *et al.* 2017); and

Family XI (Miller *et al.* 2017). For this group, we ran a third set of LMMs (LMM3) predicting the relative abundance of each taxon. Additionally, because the results from microbial studies on humans or even anthropoids may not be representative of strepsirrhine microbiomes, we ran a fourth set of exploratory LMMs (LMM4) predicting each of the five most abundant taxa we found within each strepsirrhine body site, as well as the category “Other” as a measure of rare taxa. For LMM4, we corrected for multiple hypothesis testing using the Benjamini-Hochberg method (Benjamini and Hochberg 1995). All of our analysis scripts, as well as the data and metadata files needed to reproduce our results in R are available on Open Science Framework at <https://osf.io/usynq/>. Sequencing reads are also available on the National Center for Biotechnology Information’s Sequence Read Archive (BioProject ID #TBD, BioSample accession #s TBD).

## Results

### Stable traits: Patterns in relation to species, mating system, and body site

#### *General species patterns*

After bioinformatic analyses, our 83 remaining microbial samples yielded 9,238,389 sequences with an average of 38,018 reads per sample. The sequences were classified into 1,556 genera within 34 identified bacterial phyla. Across both host species, the microbiota at all three body sites were dominated by taxa in the Bacteroidetes, Firmicutes, Fusobacteria, and Proteobacteria phyla, with smaller, site-specific contributions from the Acidobacteria, Actinobacteria, Epsilonbacteraeota, Spirochaetes, Tenericutes, and Verrucomicrobia phyla (Figure 1). Although the phyla represented in the microbiota of both species were similar across the three body sites, as anticipated, the identified genera and overall

alpha and beta diversity metrics varied significantly by host species, body site, and their interaction terms (Table 1). We present results on the microbial membership for each species by body site, below.

### *Vaginal microbiota*

The vaginal microbiota of ring-tailed lemurs and sifakas were dominated by three phyla; Bacteroides, Firmicutes, and Fusobacteria (Figure 1). Of the genera that accounted for minimally 1% of each species' vaginal microbiota, only six were shared by both species: *Bacteroides* and *Porphyromonas* (phyla Bacteroidetes), *Peptoniphilus* and *W5053* (Firmicutes), *Campylobacter* (Epsilonbacteraeota), and *Fusobacterium* (Fusobacteria). Both lemur species harbored a diverse array of taxa in the Clostridiales order. The vaginal microbiota of sifakas were dominated by three of the shared genera, *Bacteroides*, *Porphyromonas*, and *Fusobacteria*, which had a combined, mean relative abundance of 66%. These three genera are the only abundant taxa found across all three body sites in both host species.

The alpha diversities of the vaginal microbiota differed between host species. More specifically, as predicted by differences in the hosts' mating systems, the promiscuous ring-tailed lemurs harbored significantly more diverse communities than did the pair-bonded sifakas (Figure 2;  $p = 0.009$ ). Beta diversity also differed significantly between the two species (Figure 3; visualized in PCoA plot, pairwise adonis,  $R^2 = 0.38$ ,  $p < 0.05$ ). In both species, inter-individual variation in vaginal microbiota composition was significantly less than in the other two body sites (Figure 4;  $t$ -tests with Bonferroni corrections, ring-tailed lemurs: vaginal vs. labial  $t = 4.11$ ,  $p = 0.017$ , vaginal vs. axillary  $t = 7.19$ ,  $p < 0.001$ ; sifakas: vaginal vs. labial  $t = 5.97$ ,  $p < 0.001$ , vaginal vs. axillary  $t = 8.93$ ,  $p < 0.001$ ), indicating that vaginal consortia may be more constrained or stable across individuals than are labial or axillary consortia.

### *Labial microbiota*

Reflecting their physical proximity on the host, the labial microbiomes of both host species shared the same six, abundant taxa as those shared by their vaginal microbiomes, plus one additional genus, *Murdochella* (Firmicutes; Figure 1). The labial communities of ring-tailed lemurs included a large proportion of *Treponema*, a genus of anaerobic spirochetes often associated with infection or disease (Simonson *et al.* 1988; Radolf and Lukehart 2006), plus members of Corynebacteriaceae and Gammaproteobacteria. By contrast, the labial communities of sifakas were dominated by members of the Lactobacillales and Clostridiales orders.

The alpha diversity of labial microbiomes was similar between the two host species ( $p = .783$ ) and, within species, only differed significantly from those of vaginal communities in sifakas (Figure 2; ring-tailed lemur: vaginal vs. labial,  $p = 0.970$ ; sifaka: vaginal vs. labial,  $p = 0.004$ ). Only in sifakas did beta diversity in the labial microbiome differ significantly from that of the vaginal microbiome (pairwise adonis,  $R^2 = 0.09$ ,  $p < 0.05$ ). Within each species, interindividual variation in labial microbiome composition was significantly greater than that in the vaginal microbiome (Figure 4, see above), but was similar to that in the axillary microbiome (Figure 4; *t*-tests with Bonferroni corrections; ring-tailed lemurs: labial vs. axillary  $t = -1.56$ ,  $p > 0.99$ ; sifakas: labial vs. axillary  $t = -1.82$ ,  $p > 0.99$ ).

### *Axillary microbiota*

The axillary microbiomes of ring-tailed lemurs harbored balanced microbial communities, with representation from Bacteroidetes, Firmicutes, Fusobacteria, and Proteobacteria phyla, whereas those of sifakas were dominated by the Proteobacteria phyla and harbored numerous rare or ‘other’ taxa (Figure 1).

Alpha diversity of the axillary microbiomes was not significantly different between species ( $p = 0.136$ ; Figure 2). Across species, axillary microbiomes had the greatest alpha diversity of the three body sites, but differences between sites were much stronger in sifakas (Figure 2; sifaka: axillary vs. vaginal,  $p < 0.001$ , axillary vs. labial,  $p < 0.001$ ; ring-tailed lemurs: axillary vs. vaginal,  $p = 0.125$ , axillary vs. labial,  $p = 0.040$ ). This pattern of alpha diversity in sifakas likely relates to the greater relative abundances of rare taxa in sifaka axillary consortia (Figure 1). The beta diversity of axillary microbiomes differed between species (pairwise adonis,  $R^2 = 0.37$ ,  $p < 0.05$ ) and was significantly different from each species' vaginal and labial consortia (pairwise adonis; ring-tailed lemur: axillary vs. vaginal  $R^2 = 0.41$ ,  $p < 0.05$ , axillary vs. labial  $R^2 = 0.39$ ,  $p < 0.05$ ; sifaka: axillary vs. vaginal  $R^2 = 0.40$ ,  $p < 0.05$ , axillary vs. labial  $R^2 = 0.26$ ,  $p < 0.05$ ).

### **Transient factors: Patterns in relation to reproductive hormones and forest access**

#### *Endogenous factors: Cyclical, progestogenic, and estrogenic patterns*

Based on the 28 serum samples, sifakas had greater mean concentrations of  $P_4$  and  $E_2$  than did ring-tailed lemurs, although these differences did not reach statistical significance (Figure 5a;  $P_4$ :  $t = 1.84$ ,  $p = 0.077$ ;  $E_2$ :  $t = 1.25$ ,  $p = 0.266$ ). The ovarian cycles of each lemur, as represented by  $\ln(E_2/P_4)$  across the four collection times, are illustrated in Figure 5b.

Across species and body sites, we found that alpha diversity was significantly and negatively related to  $P_4$  concentrations (Figure 6; LMM1,  $t = -2.18$ ,  $p = 0.033$ ; Table 1), but significantly and positively related both to  $E_2$  concentrations (Figure 6; LMM1,  $t = 2.83$ ,  $p = 0.018$ ) and to  $\ln(E_2/P_4)$  (Figure 6; LMM2,  $t = 2.62$ ,  $p = 0.011$ ). Neither  $P_4$  nor  $E_2$  were significantly related to beta diversity (PERMANOVA,  $ps = 0.151$  and  $0.398$ , respectively).

Based on planned comparisons, we found mixed results when using absolute ovarian hormone concentrations to predict relative abundances of specific taxa of interest. We did not find any significant correlations between  $P_4$  concentrations and the relative abundances of five taxa that are prominent in the literature; however,  $E_2$  concentrations were significantly and positively correlated with the relative abundances of *Streptococcus* in the vaginal microbiomes (LMM3;  $t = 2.54, p = 0.018$ ) and of Lactobacillales (i.e., the order of lactic-acid producing bacteria that includes *Lactobacillus*) in the vaginal and labial microbiota (Figure 7b; LMM3; vaginal:  $t = 3.94, p < 0.001$ ; labial,  $t = 2.50, p = 0.046$ ) of both host species. The relationship between microbial composition and  $E_2$  concentrations varied between body sites, but the predicted patterns of correlation were similar between host species (Figure 7a).

Regarding the most abundant taxa at each host species' body site, once analyses were corrected for multiple comparisons, we found just a single statistically significant result:  $P_4$  concentrations were significantly and positively correlated with the relative abundances of *Treponema* in ring-tailed lemur vaginal microbiomes (LMM4;  $t = 6.013, p < 0.001$ ).

#### *Exogenous factors: Environmental taxa and forest access*

The lemurs' use of their available habitat, as reflected by differential access to forest enclosures, impacted microbial membership, particularly in the axillary microbiomes. Specifically, the axillary microbiomes of ring-tailed lemurs harbored several abundant taxa in the family Ruminococcaceae, which are common soil microbes (Wegner and Liesack 2016; Vo *et al.* 2017). In addition, prior to bioinformatic filtering, the axillary consortia of both species included large proportions of the order Chloroplasts or family Mitochondria, two groups that are commonly omitted from analyses of host-associated microbes, but include several known environmental taxa. These groups were particularly prevalent in sifaka axillary microbiomes; had members of Mitochondria and Chloroplasts been included in downstream analyses, they would have been the first and sixth most abundant groups, respectively. Within the identified

Mitochondria, there were three abundant fungal taxa, *Zasmidium cellare*, *Annulohypoxylon stygium*, and *Pyronema omphalodes*, which are found on environmental substrates, such as soil and trees (Seaver 1909; Moore and Korf 1963; Tribe, Thines and Weber 2006; Abdullah *et al.* 2010; Fournier and Lechat 2016; Wingfield *et al.* 2018). Across both species, individuals that gained forest access harbored greater abundances of environmental taxa. Although forest access was not significantly correlated with alpha diversity while adjusting for the other factors in our overall model (LMM1;  $t = 0.43$ ,  $p = 0.686$ ), forest access did significantly predict beta diversity across all body sites (PERMANOVA;  $R^2 = 0.021$ ,  $p \leq 0.001$ ; Table 1), even if accounting for only a small percent of the variance.

## Discussion

Our longitudinal and comparative study of multiple strepsirrhine microbiomes both reinforces existing frameworks for understanding gross variation in primates and adds novel perspectives to this framework by shedding light on more discrete patterns of host-microbe interactions. Consistent with findings across primates (Stumpf *et al.* 2010; Council *et al.* 2016), we found that microbial composition, and predictors of that composition, in strepsirrhines differed between host species and their body sites in ways that may reflect distinct functions. Although confounded with species identity, host mating system was predictably reflected in structural aspects of the lemurs' vaginal microbiota, which (if replicated in a larger number species) may indicate differing demands for maintaining host reproductive health. In addition, the labial and axillary microbiomes – potentially crucial to the manufacture of host olfactory signals – were dominated by microbes linked to odor production in the scent glands of other mammals (cite). Transient factors likewise predicted differences in microbiome structure.  $P_4$  and  $E_2$  concentrations yielded opposing associations with alpha diversity, and  $E_2$  concentrations specifically predicted abundance of Lactobacillales and *Streptococcus*, two microbial taxa that are linked to vaginal and

reproductive health in humans. Lastly, the relationship between body site and environmental microbes differed between species. Our results are based on a small number of animals and they should be considered preliminary, but collectively, they are consistent with an interpretation to be explored in future studies: in shaping bacterial membership in lemur microbiomes, transient factors build upon foundational differences governed by stable traits.

Consistent with evidence for a ‘core microbiome’ across closely related host taxa (Henderson *et al.* 2015; Nishida and Ochman 2018), we found that certain abundant genera, such as *Bacteroides*, *Porphyromonas*, and *Fusobacterium*, were shared across the three microbiomes of both species. Perhaps these genera represent a core epithelial microbiome that persists across lemur species despite species-specific patterns in bacterial community structure. Indeed, these three microbial genera were previously found in the genital microbiota of wild lemurs of different species (Yildirim *et al.* 2014; Greene *et al.* 2019). These diverse genera are often considered pathogenic in humans (Slots and Listgarten 1988; Genco, Van Dyke and Amar 1998; Signat *et al.* 2011; Darveau, Hajishengallis and Curtis 2012; Kostic *et al.* 2012); however, their widespread presence across lemurs, in the absence of disease symptomatology, could signal functional importance, rather than pathology.

With regard to their potential role in host olfactory communication, the labial microbiota of lemurs included abundant genera, such as *Porphyromonas*, *Fusobacterium*, *Campylobacter*, and *Anaerococcus*, that have been linked to the chemical signals of various vertebrate taxa (Li *et al.* 2016; Theis *et al.* 2016; Leclaire *et al.* 2017; Greene *et al.* 2019; Yamaguchi *et al.* 2019). *Treponema* and *Porphyromonas*, the two most abundant bacterial genera in the labial microbiomes of ring-tailed lemurs, are also common in human oral microbiomes, where they produce VOCs associated with halitosis (Donaldson *et al.* 2005; Porter and Scully 2006; Aylıkcı and Çolak 2013). These VOCs include dodecanoic, tetradecanoic, and other long-chain, fatty acids that also occur in the labial secretions of ring-tailed lemurs (Scordato, Dubay and Drea 2007). In this species, despite the presence of specialized glandular tissue in the labia (Drea and Weil 2008), the vagina and labia harbored similarly structured

microbial consortia. In contrast, female sifakas, had compositionally distinct vaginal and labial consortia. The different relationships between vaginal and labial microbiomes across the two host species may reflect differences in the morphology of their external genitalia (Hill 1953); ring-tailed lemurs have pronounced, deep labial folds that, relative to the superficially distinct labia of sifakas, may create different bioavailable niches between the two species.

Characterizing the gross differences in microbial community structure that accompany stable, host traits provides important context for understanding how transient factors may differentially influence microbiota and their potential functions across hosts. For instance, between ring-tailed lemurs and sifakas, the underlying differences in vaginal microbiota membership and diversity may reflect distinct strategies by which hosts harness vaginal microbiota to prevent disease transmission and promote reproductive health across the breeding season.

In women and other female anthropoids, increased  $P_4$  concentrations in the luteal phase coincide with a ‘window of vulnerability,’ during which the host is more susceptible to pathogens and STIs (Sodora *et al.* 1998; Wira and Fahey 2008; Vishwanathan *et al.* 2011; Wira, Rodriguez-Garcia and Patel 2015). Although not previously considered a component of this vulnerability, a negative relationship between  $P_4$  and microbial diversity, as suggested by our analyses, may contribute to this increased susceptibility to infection. Nevertheless, the positive relationship between  $E_2$  and microbial diversity could be a countervailing adaptation. Peak  $E_2$  concentrations typically coincide with peak fertility, proceptivity, and receptivity (i.e., sexual activity) (Dixson 1998). Here, in females of both study species, the greatest microbial diversity in the vaginal canal coincided with peak  $E_2$  concentrations. Although these females did not have access to sexually active males, the finding may suggest that natural, hormonally mediated cyclicity in microbial diversity could function to provide protection against the changing risk of disease exposure via sexual relations.

An additional mechanism by which vaginal microbes can protect against pathogens is the production and maintenance of acidic conditions, as exemplified by the dominance of the lactic acid-producing bacteria (LABs), *Lactobacillus*, in human vaginal microbiota (Kaewsrichan, Peeyananjarassri and Kongprasertkit 2006; Ravel *et al.* 2011). In the human vaginal epithelium, E<sub>2</sub> increases the production of glycogen, which *Lactobacillus* can metabolize into lactic acid, thereby reducing vaginal pH (Boskey *et al.* 2001; Mirmonsef *et al.* 2014). Similar to patterns seen in humans, the relative abundances of LABs in the vaginal microbiomes of ring-tailed lemurs and sifakas were positively correlated with E<sub>2</sub> concentrations. This correlation between E<sub>2</sub> concentrations and LAB abundances suggests that E<sub>2</sub> may regulate vaginal microbial structure similarly across different primate hosts.

These influences of stable and endogenous host traits are further combined with influences of exogenous factors, such as the hosts' habitat use and its interactions with environmental taxa. Although the diets of captive animals can homogenize gut microbial communities across host species (Clayton *et al.* 2016; McKenzie *et al.* 2017), the same may not be true of glandular microbial communities (Greene *et al.* 2019). We found that captive lemurs living under similar conditions (and receiving the same diet within species) harbored distinct epithelial microbiota depending on whether or not they had access to forest enclosures: increased forest access was related to increased abundances of environmental microbes across body sites. In particular, identified fungal taxa in the family Mitochondria were abundant in the axillary microbiomes of sifakas that had forest access. That this relationship was most strongly expressed in lemur axillary microbiomes expands on an earlier finding that, relative to humans, nonhuman anthropoids harbor more environmental microbes in their axillary microbiomes than elsewhere across the body (Council *et al.* 2016).

Because it is common practice in studies of mammalian microbiota to omit from downstream analyses entire groups of non-bacterial taxa (e.g. Mitochondria), including those that comprise known environmental taxa, relatively little is known about the contribution of these groups to commensal communities. Furthermore, when not removed from analyses, environmental bacteria are often considered

contaminants or foreign microbes and are rarely regarded as integrated members of commensal communities. Acknowledging this disparity could be an important step toward understanding how transient, environmental communities influence host-associated microbes. A consideration of both evolutionary and more proximate factors is vital to understanding the dynamic composition of microbiota over time and, ultimately, the functional relevance of microbiomes to their hosts.

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### References

Abdullah SK, Monfort E, Asensio L *et al.* Soil mycobiota of date palm plantations in Elche, SE Spain. *Czech Mycol* 2010;61:149–62.

Albone ES, Perry GC. Anal sac secretion of the red fox, *Vulpes vulpes*; volatile fatty acids and diamines: implications for a fermentation hypothesis of chemical recognition. *J Chem Ecol* 1976;2:101–11.

Amato KR, Sanders JG, Song SJ *et al.* Evolutionary trends in host physiology outweigh dietary niche in structuring primate gut microbiomes. *ISME J* 2019;1.

Aylikci BU, Çolak H. Halitosis: From diagnosis to management. *J Nat Sci Biol Med* 2013;4:14.

Baird DD, Weinberg CR, Wilcox AJ *et al.* Using the ratio of urinary oestrogen and progesterone metabolites to estimate day of ovulation. *Stat Med* 1991;10:255–66.

Belkaid Y, Segre JA. Dialogue between skin microbiota and immunity. *Science* (80- ) 2014;346:954–9.

Benavidez KM, Iruri-Tucker A, Steiniche T *et al.* Primate microbial endocrinology: An uncharted frontier. *Am J Primatol* 2019;e23053.

Benjamini Y, Hochberg Y. Controlling the false discovery rate: a practical and powerful approach to multiple testing. *J R Stat Soc Ser B* 1995;289–300.

Bezirtzoglou E, Voidarou C, Papadaki A *et al.* Hormone therapy alters the composition of the vaginal microflora in ovariectomized rats. *Microb Ecol* 2008;55:751–9.

Bogart MH, Kumamoto AT, Lasley BL. A comparison of the reproductive cycle of three species of Lemur. *Folia Primatol* 1977;28:134–43.

Bolyen E, Rideout JR, Dillon MR *et al.* Reproducible, interactive, scalable and extensible microbiome data science using QIIME 2. *Nat Biotechnol* 2019;37:852–7.

Boskey ER, Cone RA, Whaley KJ *et al.* Origins of vaginal acidity: high D/L lactate ratio is consistent with bacteria being the primary source. *Hum Reprod* 2001;16:1809–13.

Brockman DK, Whitten PL, Russell E *et al.* Application of fecal steroid techniques to the reproductive endocrinology of female Verreaux's sifaka (*Propithecus verreauxi*). *Am J Primatol* 1995;36:313–25.

Brockman, D. K. (1999). Reproductive behavior of female *Propithecus verreauxi* at Beza Mahafaly, Madagascar. *Int J Primatol*, 20(3), 375–398.

Brooks AW, Kohl KD, Brucker RM *et al.* Phylosymbiosis: relationships and functional effects of microbial communities across host evolutionary history. *PLoS Biol* 2016;14:e2000225.

Callahan BJ, McMurdie PJ, Rosen MJ *et al.* DADA2: high-resolution sample inference from Illumina amplicon data. *Nat Methods* 2016;13:581.

Caporaso JG, Lauber CL, Walters WA *et al.* Ultra-high-throughput microbial community analysis on the Illumina HiSeq and MiSeq platforms. *ISME J* 2012;6:1621.

Clayton JB, Vangay P, Huang H *et al.* Captivity humanizes the primate microbiome. *Proc Natl Acad Sci* 2016;201521835.

Council SE, Savage AM, Urban JM *et al.* Diversity and evolution of the primate skin microbiome. *Proc. R. Soc. B. Vol 283.* The Royal Society, 2016, 20152586.

Cowley HM, Heiss GS. Changes in vaginal bacterial flora during the oestrous cycle of the mouse. *Microb Ecol Health Dis* 1991;4:229–35.

Darveau RP, Hajishengallis G, Curtis MA. *Porphyromonas gingivalis* as a potential community activist for disease. *J Dent Res* 2012;91:816–20.

Davenport ER, Sanders JG, Song SJ *et al.* The human microbiome in evolution. *BMC Biol* 2017;15:127.

delBarco-Trillo J, Burkert BA, Goodwin TE *et al.* Night and day: the comparative study of strepsirrhine primates reveals socioecological and phylogenetic patterns in olfactory signals. *J Evol Biol* 2011;24:82–98.

Dixson AF. *Primate Sexuality: Comparative Studies of the Prosimians, Monkeys, Apes, and Human Beings*. Oxford: Oxford University Press, 1998.

Doherty, I. A., Padian, N. S., Marlow, C., & Aral, S. O. (2005). Determinants and consequences of sexual networks as they affect the spread of sexually transmitted infections. *J Infect Dis* 191(Supplement\_1), S42–S54.

Donaldson AC, McKenzie D, Riggio MP *et al.* Microbiological culture analysis of the tongue anaerobic microflora in subjects with and without halitosis. *Oral Dis* 2005;11:61–3.

Drea CM. Sex and seasonal differences in aggression and steroid secretion in Lemur catta: are socially dominant females hormonally ‘masculinized’? *Horm Behav* 2007;51:555–67.

Drea CM. Design, delivery and perception of condition-dependent chemical signals in strepsirrhine primates: implications for human olfactory communication. *Philos Trans R Soc B* 2019.

Drea CM, Weil A. External genital morphology of the ring-tailed lemur (Lemur catta): Females are naturally “masculinized.” *J Morphol* 2008;269:451–63.

Eschenbach DA, Thwin SS, Patton DL *et al.* Influence of the normal menstrual cycle on vaginal tissue, discharge, and microflora. *Clin Infect Dis* 2000;30:901–7.

Evans CS, Goy RW. Social behaviour and reproductive cycles in captive ring-tailed lemurs (Lemur catta). *J Zool* 1968;156:181–97.

Ezenwa VO, Williams AE. Microbes and animal olfactory communication: Where do we go from here? *BioEssays* 2014;36:847–54.

Ferris MJ, Norori J, Zozaya-Hinchliffe M *et al.* Cultivation-independent analysis of changes in bacterial vaginosis flora following metronidazole treatment. *J Clin Microbiol* 2007;45:1016–8.

Finley RL, Collignon P, Larsson DGJ *et al.* The scourge of antibiotic resistance: the important role of the environment. *Clin Infect Dis* 2013;57:704–10.

Fournier J, Lechat C. Some Annulohypoxylon spp. (Xylariaceae) from French Guiana, including three new species. *Ascomycete org* 2016;8:33–53.

Genco CA, Van Dyke T, Amar S. Animal models for *Porphyromonas gingivalis*-mediated periodontal disease. *Trends Microbiol* 1998;6:444–9.

Gilbert JA, Blaser MJ, Caporaso JG *et al.* Current understanding of the human microbiome. *Nat Med* 2018;24:392.

Gorman M, Nedwell DB, Smith RM. An analysis of the contents of the anal scent pockets of *Herpestes auropunctatus* (Carnivora: Viverridae). *J Zool* 1974;172:389–99.

Greene LK, Bornbusch SL, McKenney EA *et al.* The importance of scale in comparative microbiome research: New insights from the gut and glands of captive and wild lemurs. *Am J Primatol* 2019.

Greene LK, Drea CM. Love is in the air: sociality and pair bondedness influence sifaka reproductive signalling. *Anim Behav* 2014;88:147–56.

Greene LK, McKenney EA. The inside tract: The appendicular, cecal, and colonic microbiome of captive aye-ayes. *Am J Phys Anthropol* 2018.

Grice EA. The skin microbiome: potential for novel diagnostic and therapeutic approaches to cutaneous disease. *Seminars in Cutaneous Medicine and Surgery*. Vol 33. NIH Public Access, 2014, 98.

Grice EA, Kong HH, Conlan S *et al.* Topographical and temporal diversity of the human skin microbiome. *Science* (80- ) 2009;324:1190–2.

Groussin M, Mazel F, Sanders JG *et al.* Unraveling the processes shaping mammalian gut microbiomes over evolutionary time. *Nat Commun* 2017;8:14319.

Hayes RA, Morelli TL, Wright PC. Anogenital gland secretions of Lemur catta and Propithecus verreauxi coquereli: a preliminary chemical examination. *Am J Primatol Off J Am Soc Primatol* 2004;63:49–62.

Henderson G, Cox F, Ganesh S *et al.* Rumen microbial community composition varies with diet and host, but a core microbiome is found across a wide geographical range. *Sci Rep* 2015;5:14567.

Hill WC. *Primates (Comparative Anatomy and Taxonomy). I. Strepsirhini*. London: The Edinburgh University Press, 1953.

Van Horn R, Resko JA. The reproductive cycle of the ring-tailed lemur (Lemur catta): sex steroid levels and sexual receptivity under controlled photoperiods. *Endocrinology* 1977;101:1579–86.

Huttenhower C, Gevers D, Knight R *et al.* Structure, function and diversity of the healthy human microbiome. *Nature* 2012;486:207.

Hyde ER, Navas-Molina JA, Song SJ *et al.* The oral and skin microbiomes of captive komodo dragons are significantly shared with their habitat. *MSystems* 2016;1:e00046-16.

Jakobsson T, Forsum U. Lactobacillus iners: a marker of changes in the vaginal flora? *J Clin Microbiol* 2007;45:3145.

Jones KE, Patel NG, Levy MA *et al.* Global trends in emerging infectious diseases. *Nature* 2008;451:990.

Kaewsrichan J, Peeyananjarassri K, Kongprasertkit J. Selection and identification of anaerobic lactobacilli producing inhibitory compounds against vaginal pathogens. *FEMS Immunol Med Microbiol* 2006;48:75–83.

Katoh K, Misawa K, Kuma K *et al.* MAFFT: a novel method for rapid multiple sequence alignment based on fast Fourier transform. *Nucleic Acids Res* 2002;30:3059–66.

Kenyon, C. R., Delva, W., & Brotman, R. M. (2019). Differential sexual network connectivity offers a parsimonious explanation for population-level variations in the prevalence of bacterial vaginosis: a data-driven, model-supported hypothesis. *BMC Women's Health*, 19(1), 8.

Kokko H, Ranta E, Ruxton G *et al.* Sexually transmitted disease and the evolution of mating systems. *Evolution (N Y)* 2002;56:1091–100.

Kornman KS, Loesche WJ. Effects of estradiol and progesterone on *Bacteroides melaninogenicus* and *Bacteroides gingivalis*. *Infect Immun* 1982;35:256–63.

Kostic AD, Gevers D, Pedamallu CS *et al.* Genomic analysis identifies association of *Fusobacterium* with colorectal carcinoma. *Genome Res* 2012;22:292–8.

Kumar PS. Sex and the subgingival microbiome: do female sex steroids affect periodontal bacteria? *Periodontol 2000* 2013;61:103–24.

Larsen B, Markovetz AJ, Galask RP. Role of estrogen in controlling the genital microflora of female rats. *Appl Environ Microbiol* 1977;34:534–40.

Lax S, Smith DP, Hampton-Marcell J *et al.* Longitudinal analysis of microbial interaction between humans and the indoor environment. *Science (80- )* 2014;345:1048–52.

Leclaire S, Jacob S, Greene LK *et al.* Social odours covary with bacterial community in the anal secretions of wild meerkats. *Sci Rep* 2017;7:3240.

Ley RE, Hamady M, Lozupone C *et al.* Evolution of mammals and their gut microbes. *Science (80- )* 2008;320:1647–51.

Li D, Chen B, Zhang L *et al.* The musk chemical composition and microbiota of Chinese forest musk deer males. *Sci Rep* 2016;6:18975.

Liljeros, F., Edling, C. R., & Amaral, L. A. N. (2003). Sexual networks: implications for the transmission of sexually transmitted infections. *Microbes Infect*, 5(2), 189–196.

Loriaux DL, Ruder HJ, Knab DR *et al.* Estrone sulfate, estrone, estradiol and estriol plasma levels in human pregnancy. *J Clin Endocrinol Metab* 1972;35:887–91.

Lozupone, C., & Knight, R. (2005). UniFrac: a new phylogenetic method for comparing microbial communities. *Appl Environ Microb*, 71(12), 8228–8235.

Lozupone, C., Lladser, M. E., Knights, D., Stombaugh, J., & Knight, R. (2011). UniFrac: an effective distance metric for microbial community comparison. *ISME*, 5(2), 169.

MacManes MD. Promiscuity in mice is associated with increased vaginal bacterial diversity. *Naturwissenschaften* 2011;98:951.

Martin RD. Review lecture: Adaptive radiation and behaviour of the Malagasy lemurs. *Phil Trans R Soc Lond B* 1972;264:295–352.

Martinez Arbizu P. pairwiseAdonis: Pairwise multilevel comparison using adonis. *R Packag version 00 2017;1.*

McKenzie VJ, Song SJ, Delsuc F *et al.* The Effects of Captivity on the Mammalian Gut Microbiome. *Integr Comp Biol 2017;57:690–704.*

Miller EA, Beasley DE, Dunn RR *et al.* Lactobacilli dominance and vaginal pH: why is the human vaginal microbiome unique? *Front Microbiol 2016;7:1936.*

Miller EA, Livermore JA, Alberts SC *et al.* Ovarian cycling and reproductive state shape the vaginal microbiota in wild baboons. *Microbiome 2017;5:8.*

Mirmonsef P, Hotton AL, Gilbert D *et al.* Free glycogen in vaginal fluids is associated with Lactobacillus colonization and low vaginal pH. *PLoS One 2014;9:e102467.*

Mishell Jr DR, Nakamura RM, Crosignani PG *et al.* Serum gonadotropin and steroid patterns during the normal menstrual cycle. *Am J Obstet Gynecol 1971;111:60–5.*

Misic AM, Gardner SE, Grice EA. The wound microbiome: modern approaches to examining the role of microorganisms in impaired chronic wound healing. *Adv wound care 2014;3:502–10.*

Moore EJ, Korf RP. The genus Pyronema. *Bull Torrey Bot club 1963;33–42.*

Nakagawa S, Fujii H, Machida Y *et al.* A longitudinal study from prepuberty to puberty of gingivitis: Correlation between the occurrence of Prevotella intermedia and sex hormones. *J Clin Periodontol 1994;21:658–65.*

Narushima S, Itoh K, Sankai T *et al.* Changes in normal vaginal flora of African green monkeys (*Cercopithecus aethiops*) during the menstrual cycle. *Exp Anim 1997;46:47–52.*

Nieuwdorp M, Gilijamse PW, Pai N *et al.* Role of the microbiome in energy regulation and metabolism. *Gastroenterology 2014;146:1525–33.*

Nishida AH, Ochman H. Rates of gut microbiome divergence in mammals. *Mol Ecol 2018;27:1884–97.*

Noguchi K, Tsukumi K, Udon T *et al.* Normal vaginal flora in chimpanzees (*Pan troglodytes*): qualitative and quantitative study. *Comp Med 2004;54:705–12.*

Nunn CL, Scully EJ, Kutsukake N *et al.* Mating competition, promiscuity, and life history traits as predictors of sexually transmitted disease risk in primates. *Int J Primatol 2014;35:764–86.*

Peterson J, Garges S, Giovanni M *et al.* The NIH human microbiome project. *Genome Res 2009;19:2317–23.*

Phillips CD, Phelan G, Dowd SE *et al.* Microbiome analysis among bats describes influences of host phylogeny, life history, physiology and geography. *Mol Ecol 2012;21:2617–27.*

Porter SR, Scully C. Oral malodour (halitosis). *Bmj 2006;333:632–5.*

Power ML, Quaglieri C, Schulkin J. Reproductive microbiomes: a new thread in the microbial network. *Reprod Sci* 2017;24:1482–92.

Price MN, Dehal PS, Arkin AP. FastTree 2—approximately maximum-likelihood trees for large alignments. *PLoS One* 2010;5:e9490.

Quast C, Pruesse E, Yilmaz P *et al.* The SILVA ribosomal RNA gene database project: improved data processing and web-based tools. *Nucleic Acids Res* 2012;41:D590–6.

Radolf JD, Lukehart SA. *Pathogenic Treponema: Molecular and Cellular Biology*. Horizon Scientific Press, 2006.

Ravel J, Gajer P, Abdo Z *et al.* Vaginal microbiome of reproductive-age women. *Proc Natl Acad Sci* 2011;108:4680–7.

Redondo-Lopez V, Cook RL, Sobel JD. Emerging role of lactobacilli in the control and maintenance of the vaginal bacterial microflora. *Rev Infect Dis* 1990;12:856–72.

Reid G, Brigidi P, Burton JP *et al.* Microbes central to human reproduction. *Am J Reprod Immunol* 2015;73:1–11.

Rivera AJ, Frank JA, Stumpf R *et al.* Differences between the normal vaginal bacterial community of baboons and that of humans. *Am J Primatol* 2011;73:119–26.

Ross AA, Müller KM, Weese JS *et al.* Comprehensive skin microbiome analysis reveals the uniqueness of human skin and evidence for phyllosymbiosis within the class Mammalia. *Proc Natl Acad Sci* 2018;115:E5786–95.

Rothman MS, Carlson NE, Xu M *et al.* Reexamination of testosterone, dihydrotestosterone, estradiol and estrone levels across the menstrual cycle and in postmenopausal women measured by liquid chromatography–tandem mass spectrometry. *Steroids* 2011;76:177–82.

Schommer NN, Gallo RL. Structure and function of the human skin microbiome. *Trends Microbiol* 2013;21:660–8.

Scordato ES, Drea CM. Scents and sensibility: information content of olfactory signals in the ringtailed lemur, *Lemur catta*. *Anim Behav* 2007;73:301–14.

Scordato ES, Dubay G, Drea CM. Chemical composition of scent marks in the ringtailed lemur (*Lemur catta*): glandular differences, seasonal variation, and individual signatures. *Chem Senses* 2007;32:493–504.

Seaver FJ. Studies in Pyrophilous Fungi—I. The Occurrence and Cultivation of *Pyronema*. *Mycologia* 1909;1:131–9.

Sharon G, Sampson TR, Geschwind DH *et al.* The central nervous system and the gut microbiome. *Cell* 2016;167:915–32.

Sharon G, Segal D, Ringo JM *et al.* Commensal bacteria play a role in mating preference of *Drosophila*.

melanogaster. *Proc Natl Acad Sci* 2010;107:20051–6.

Sherman BM, West JH, Korenman SG. The menopausal transition: analysis of LH, FSH, estradiol, and progesterone concentrations during menstrual cycles of older women. *J Clin Endocrinol Metab* 1976;42:629–36.

Signat B, Roques C, Poulet P *et al.* Role of *Fusobacterium nucleatum* in periodontal health and disease. *Curr Issues Mol Biol* 2011;13:25–36.

Simonson LG, Goodman CH, Bial JJ *et al.* Quantitative relationship of *Treponema denticola* to severity of periodontal disease. *Infect Immun* 1988;56:726–8.

Slots J, Listgarten MA. *Bacteroides gingivalis*, *Bacteroides intermedius* and *Actinobacillus actinomycetemcomitans* in human periodontal diseases. *J Clin Periodontol* 1988;15:85–93.

Sodora DL, Gettie A, Miller CJ *et al.* Vaginal transmission of SIV: assessing infectivity and hormonal influences in macaques inoculated with cell-free and cell-associated viral stocks. *AIDS Res Hum Retroviruses* 1998;14:S119–23.

Spear GT, Gilbert D, Sikaroodi M *et al.* Identification of rhesus macaque genital microbiota by 16S pyrosequencing shows similarities to human bacterial vaginosis: implications for use as an animal model for HIV vaginal infection. *AIDS Res Hum Retroviruses* 2010;26:193–200.

Starling AP, Charpentier MJE, Fitzpatrick C *et al.* Seasonality, sociality, and reproduction: long-term stressors of ring-tailed lemurs (*Lemur catta*). *Horm Behav* 2010;57:76–85.

Stumpf RM, Yildirim S, Leigh S *et al.* Comparative primate vaginal microbial ecology. *AMERICAN JOURNAL OF PHYSICAL ANTHROPOLOGY*. WILEY-LISS DIV JOHN WILEY & SONS INC, 111 RIVER ST, HOBOKEN, NJ 07030 USA, 2010, 226.

Theis KR, Venkataraman A, Wagner AP *et al.* Age-related variation in the scent pouch bacterial communities of striped hyenas (*Hyaena hyaena*). *Chemical Signals in Vertebrates* 13. Springer, 2016, 87–103.

Thrall PH, Antonovics J, Dobson AP. Sexually transmitted diseases in polygynous mating systems: prevalence and impact on reproductive success. *Proc R Soc London Ser B Biol Sci* 2000;267:1555–63.

Tribe HT, Thines E, Weber RWS. Moulds that should be better known: the wine cellar mould, *Racodium cellare* Persoon. *Mycologist* 2006;20:171–5.

Verhulst NO, Umanets A, Weldegergis BT *et al.* Do apes smell like humans? The role of skin bacteria and volatiles of primates in mosquito host selection. *J Exp Biol* 2018;221:jeb185959.

Vishwanathan SA, Guenthner PC, Lin CY *et al.* High susceptibility to repeated, low-dose, vaginal SHIV exposure late in the luteal phase of the menstrual cycle of pigtail macaques. *JAIDS J Acquir Immune Defic Syndr* 2011;57:261–4.

Vo N, Tsai TC, Maxwell C *et al.* Early exposure to agricultural soil accelerates the maturation of the

early-life pig gut microbiota. *Anaerobe* 2017;45:31–9.

Walke JB, Becker MH, Loftus SC *et al.* Amphibian skin may select for rare environmental microbes. *ISME J* 2014;8:2207.

Wegner C, Liesack W. Microbial community dynamics during the early stages of plant polymer breakdown in paddy soil. *Environ Microbiol* 2016;18:2825–42.

Wingfield BD, Bills GF, Dong Y *et al.* Draft genome sequence of *Annulohypoxylon stygium*, *Aspergillus mulundensis*, *Berkeleyomyces basicola* (syn. *Thielaviopsis basicola*), *Ceratocystis smalleyi*, two *Cercospora beticola* strains, *Coleophoma cylindrospora*, *Fusarium fracticaudum*, *Phialophora cf. hyal*. *IMA Fungus* 2018;9:199.

Wira CR, Fahey J V. A new strategy to understand how HIV infects women: identification of a window of vulnerability during the menstrual cycle. *AIDS* 2008;22:1909.

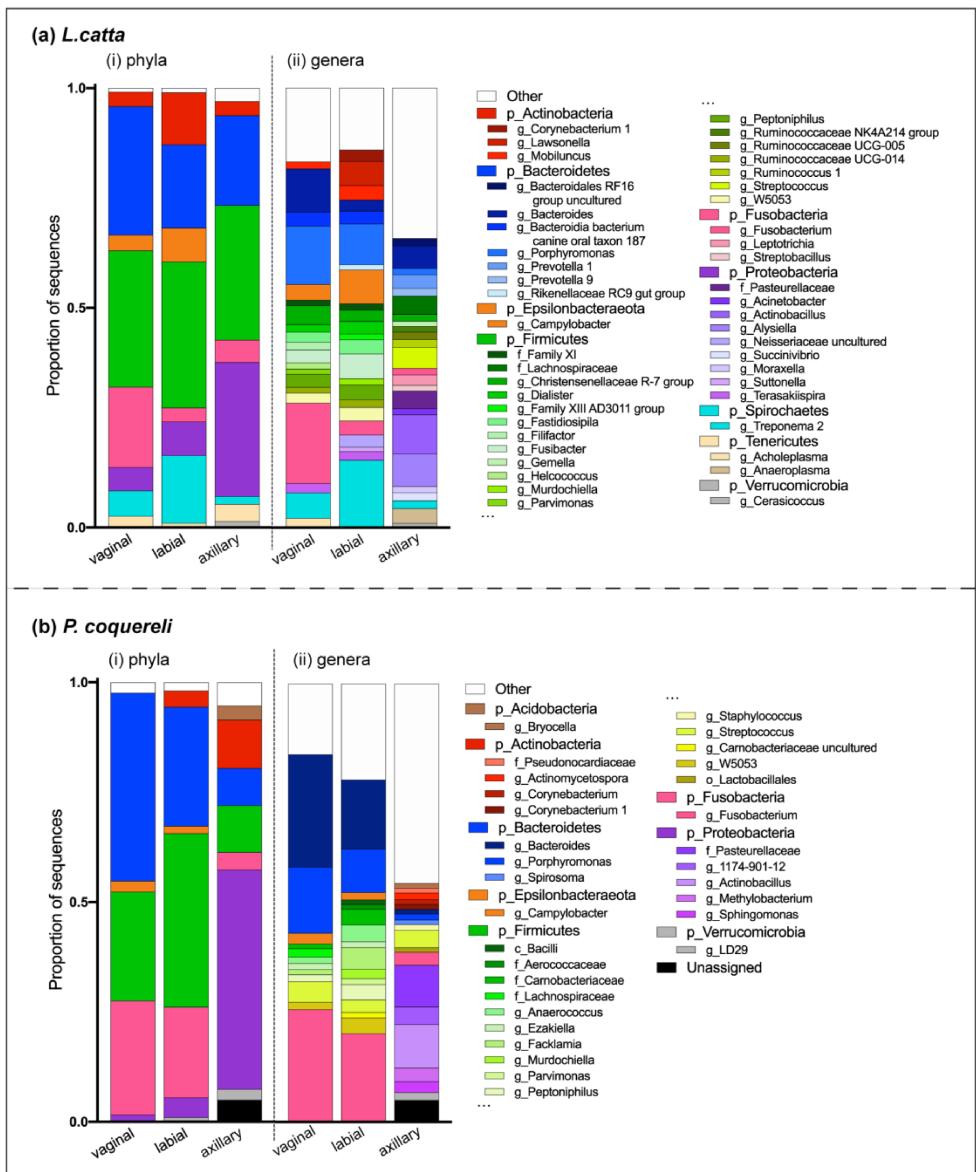
Wira CR, Rodriguez-Garcia M, Patel M V. The role of sex hormones in immune protection of the female reproductive tract. *Nat Rev Immunol* 2015;15:217.

Wood SN. Fast stable restricted maximum likelihood and marginal likelihood estimation of semiparametric generalized linear models. *J R Stat Soc Ser B (Statistical Methodol)* 2011;73:3–36.

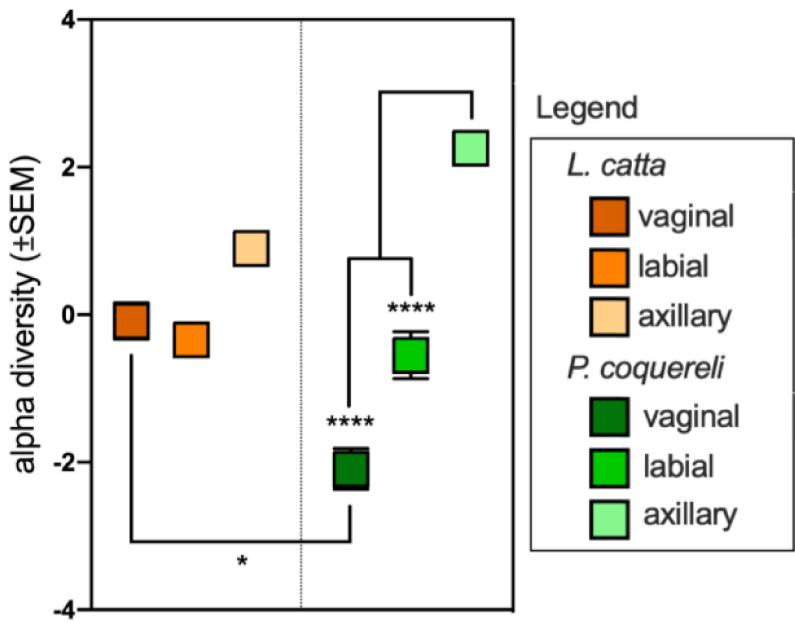
Yamaguchi MS, Ganz HH, Cho AW *et al.* Bacteria isolated from bengal cat (*Felis catus* × *Prionailurus bengalensis*) anal sac secretions produce volatile compounds associated with animal signaling. *BioRxiv* 2019:625079.

Yarza P, Yilmaz P, Pruesse E *et al.* Uniting the classification of cultured and uncultured bacteria and archaea using 16S rRNA gene sequences. *Nat Rev Microbiol* 2014;12:635.

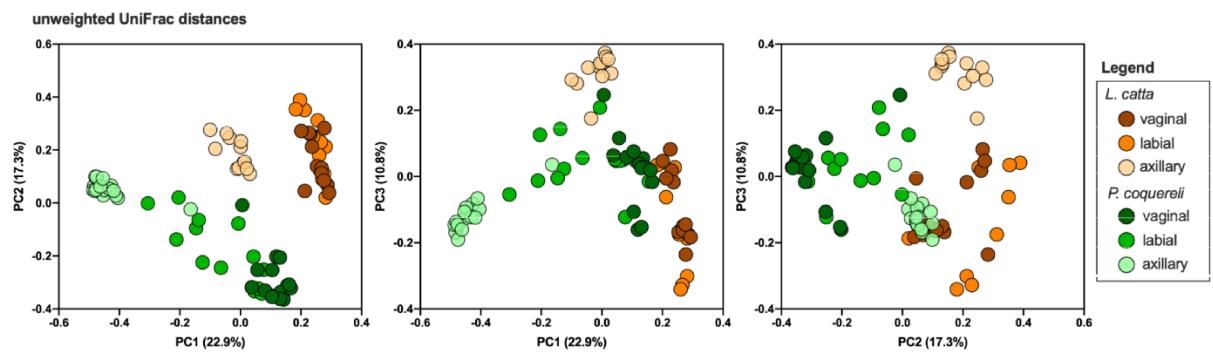
Yildirim S, Yeoman CJ, Janga SC *et al.* Primate vaginal microbiomes exhibit species specificity without universal *Lactobacillus* dominance. *ISME J* 2014;8:2431.



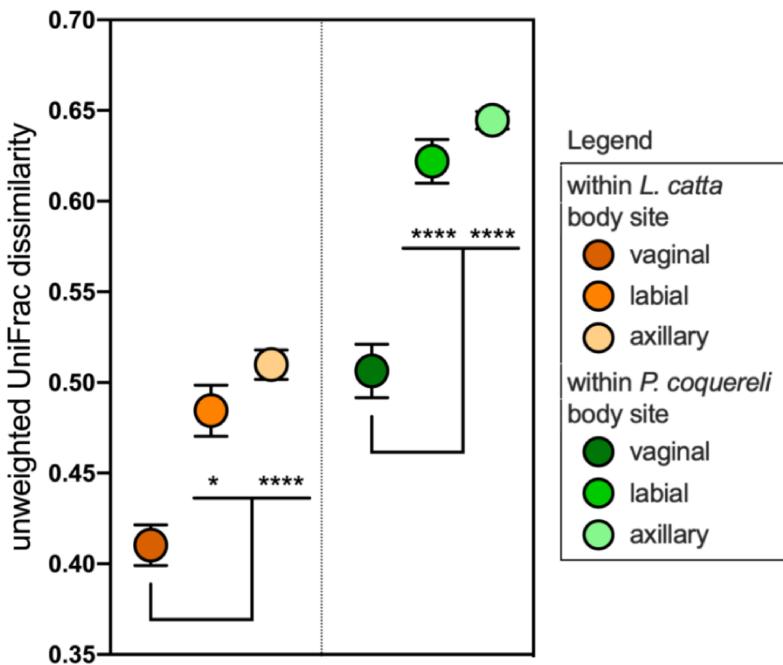
**Figure 1.** The relative abundances of bacterial taxa in the vaginal, labial, and axillary microbiomes of (a) ring-tailed lemurs (*L. catta*) and (b) sifakas (*P. coquereli*). For each microbiomes, bacterial (i) phyla and (ii) genera representing less than 1% of the microbiomes we combined into “Other”.



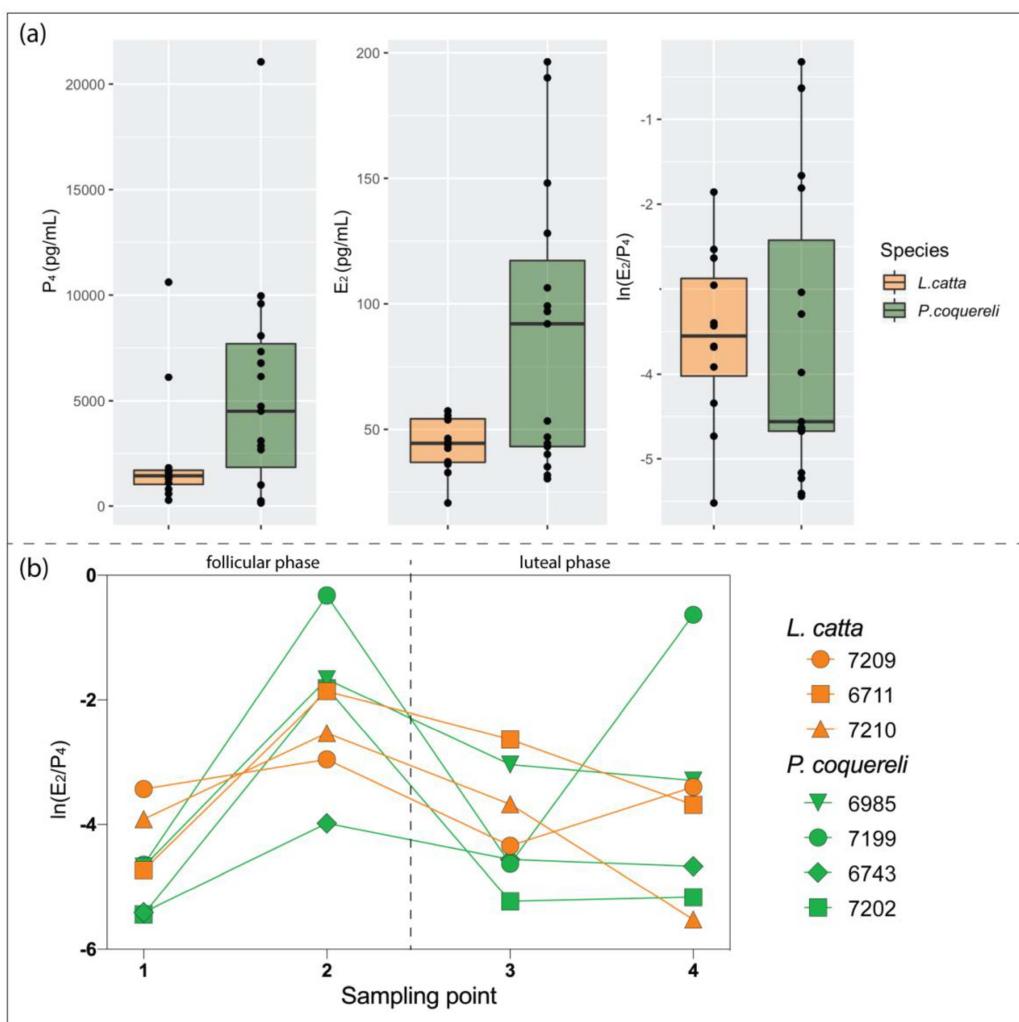
**Figure 2.** Alpha diversity with standard error means (SEM) across the three body sites in both species. Kruskal-Wallis test with Dunn's multiple comparison corrections;  $p < 0.05^*$ ,  $p < 0.0001^{****}$ .



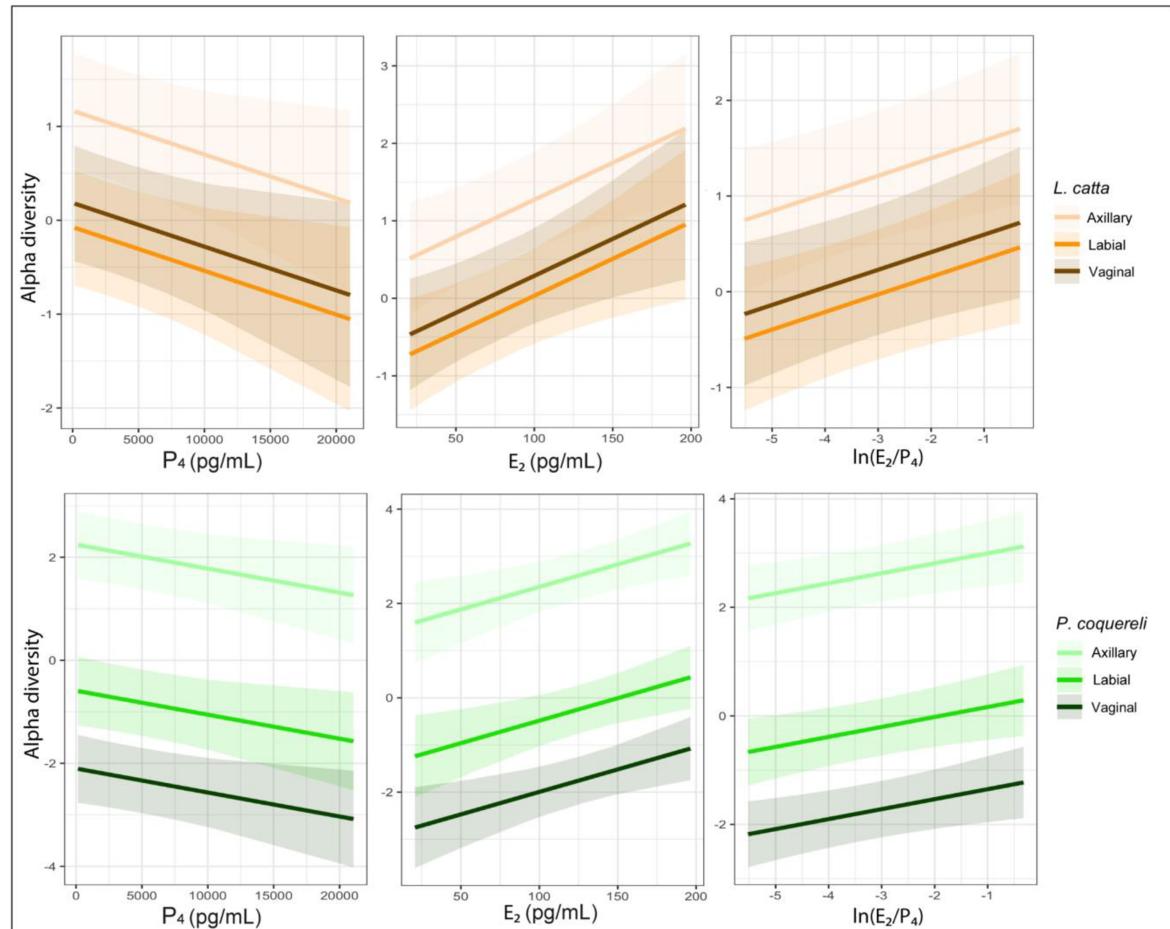
**Figure 3.** PCoA of unweighted UniFrac distances showing coordinate spaces of principal components 1, 2, and 3.



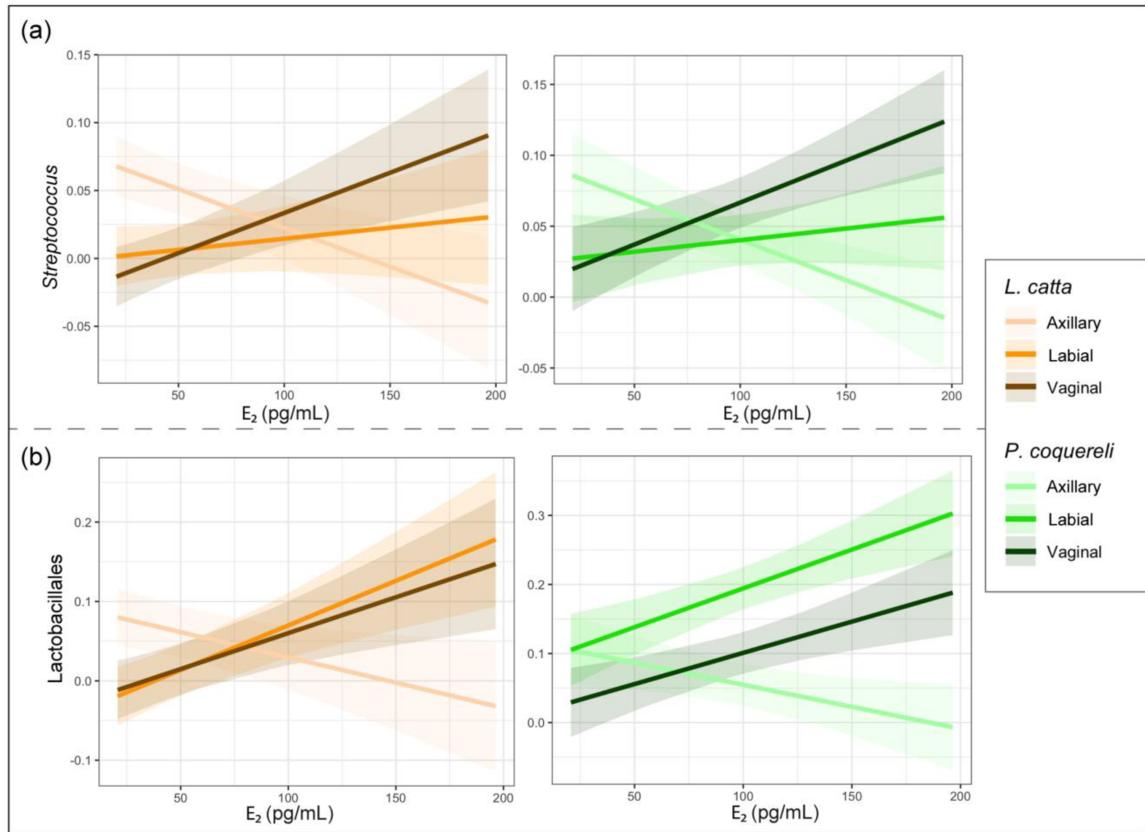
**Figure 4.** Variation in unweighted UniFrac distances between all samples within a given microbiome. Greater values indicate greater dissimilarity and greater interindividual variation in microbiome composition. Significance determined using *t*-tests with Bonferroni corrections.



**Figure 5.** Variation in (a)  $E_2$  and  $P_4$  concentrations and  $\ln E_2/P_4$  in both species and (b) variation in each lemur's  $\ln E_2/P_4$  across the four sampling points with inferred cycle phase.



**Figure 6.** Model-based predictions of alpha diversity from  $P_4$  and  $E_2$  independently (GAM 1), and from  $\ln(E_2/P_4)$  (GAM 2).



**Figure 7.** Model-based predictions of (a) *Streptococcus* and (b) *Lactobacillales* abundances from  $E_2$  concentrations.

Table 1. Results of multivariate analyses of microbiome alpha diversity (GAM 1 & 2), and beta diversity (PERMANOVA). Bolded results are statistically significant ( $p < 0.05$ ).

<b>LMM 1:</b> alpha diversity ~ species*body site + free-ranging + P <sub>4</sub> + E <sub>2</sub> + (1 Animal/Gland)	<i>F</i>	<i>p</i>
Species	3.745	0.111
<b>Body Site</b>	<b>75.684</b>	<b>&lt;0.001</b>
Free-ranging status	0.184	0.686
<b>P<sub>4</sub></b>	<b>4.729</b>	<b>0.033</b>
<b>E<sub>2</sub></b>	<b>8.028</b>	<b>0.081</b>
<b>Species × Body Site</b>	<b>27.677</b>	<b>&lt;0.001</b>
<hr/>		
<b>LMM 2:</b> alpha diversity ~ species*body site + free-ranging + ln(E <sub>2</sub> /P <sub>4</sub> ) + (1 Animal/Gland)	<i>F</i>	<i>p</i>
Species	0.765	0.436
<b>Body Site</b>	<b>75.716</b>	<b>&lt;0.001</b>
Free-ranging status	0.482	0.527
ln(E <sub>2</sub> /P <sub>4</sub> )	<b>6.873</b>	<b>0.011</b>
<b>Species × Body Site</b>	<b>27.705</b>	<b>&lt;0.001</b>
<hr/>		
<b>PERMANOVA:</b> beta diversity ~ species*body site + animal/body site + free-ranging + P <sub>4</sub> + E <sub>2</sub> (strata = animal)	R <sup>2</sup>	<i>p</i>
Species	<b>0.178</b>	<b>&lt;0.001</b>
Body site	<b>0.179</b>	<b>&lt;0.001</b>
<b>Free-ranging status</b>	<b>0.021</b>	<b>&lt;0.001</b>
P <sub>4</sub>	0.009	0.151
E <sub>2</sub>	0.006	0.398
<b>Animal</b>	<b>0.061</b>	<b>&lt;0.001</b>

Species × Body site	<b>0.118</b>	<b>&lt;0.001</b>
Animal × Body Site	<b>0.084</b>	<b>0.038</b>