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## Vaginal Microbiome Diversity and Preterm Birth: Results of a Nested Case Control Study in Peru

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#### Abstract

**Purpose**—Preterm birth (PTB) is a major cause of neonatal mortality. The vaginal microbiome is associated with PTB, but results vary across racial/ethnic populations. Some evidence suggests gestational age affects this association. We investigated these associations in a novel population, conducting a *post hoc* analysis assessing if associations differed between women swabbed at different gestational ages.

**Methods**—We compared vaginal microbiomes from women with PTB (N=25) to a random sample of women with term births (N=100) among participants in the Pregnancy Outcomes, Maternal and Infant Study (PrOMIS), conducted in Lima, Peru. Using DADA2 we identified taxa from 16S DNA sequencing and used Dirichlet multinomial mixture models to group into community state types (CSTs).

**Results**—If gestational age at sampling was not considered, no CST, (diverse, *Lactobacillus*dominated or *L. iners*-dominated) was associated with PTB. Among women sampled before 12 weeks' gestation, women with *Lactobacillus*-dominated CST's were less likely to have a PTB than those with a diverse CST. Among those swabbed between 12 to 16 weeks' gestation the reverse was true.

**Conclusions**—Our study supports previous literature suggesting that what constitutes a healthy vaginal microbiome varies by race/ethnicity. Longitudinal studies are necessary to disentangle affects of vaginal microbiome differences over gestation.

#### Keywords

Premature Birth; Microbiota; Host-microbial interactions; Molecular epidemiology

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#### Introduction

Preterm birth (PTB) is a major cause of neonatal mortality worldwide (1–3). Infants born preterm are more likely to suffer from respiratory distress syndrome, necrotizing enterocolitis, and intraventricular hemorrhage and developmental delays (2,4,5). Twenty-five to thirty percent of preterm births are attributed to intrauterine infection and subsequent immune response (4,6,7). The most common pathway to intrauterine infection is ascent from the vagina and cervix (4); bacterial vaginosis (BV) is associated with 1.5- to 3-fold increases risk for PTB (4). However, interventions targeting BV have been unsuccessful (6,8).

Next Generation Sequencing technologies make it possible to characterize complex microbial communities associated with PTB (9–12). However, findings from studies deploying these novel methods have been inconsistent, due in part to differences in study design, populations studied, and bioinformatics and statistical analytical techniques (2,13–15). Nonetheless, available evidence suggests that the vaginal microbiome among pregnant women is characterized by increased community stability and decreased community diversity when compared with their non-pregnant counterparts (2,16). For example, Aagaard *et al.* reported that the Shannon diversity (a measure of species diversity in a community) of the vaginal microbiome decreased with increasing gestational age among pregnant women (16). This observation was corroborated by Stout *et al.* using a cohort mostly of African American women. However, following a comparison of a predominantly Caucasian cohort to a predominantly African American cohort Callahan *et al.* concluded that PTB microbiota associations are population dependent (13). Specifically, *L. crispatus* and all *Lactobacillus* species occurred less frequently in the American-American cohort, although in both cohorts there was apparent exclusion of *Gardnerella vaginalis* by *L. crispatus*.

The patterns of microbiota changes during pregnancy also may be predictive of PTB. Stout *et al.* showed that women with subsequent PTB had a significantly greater decrease in vaginal microbiome diversity, richness and evenness between the first and second trimester compared to those with term deliveries - by the third trimester, there were no differences in the vaginal microbiome by term status (17). Fettweis *et al.* found that among women with PTB, taxa associated with BV tended to decrease in abundance throughout pregnancy, while *L. crispatus* increased. Fettweis *et al.* also noted that race affected changes over time in the vaginal microbiome during pregnancy, with Caucasian women exhibiting more stable microbiomes, although *G. vaginalis* increased among Caucasian women with PTB (18). On balance, available evidence suggests that gestational age-specific changes in the vaginal microbiome may be predictive of term status, but these findings vary by race/ethnicity. Whether these alterations are risk factors or risk markers of PTB remains uncertain.

Given the available evidence, we conducted a pilot case-control study, nested within a wellcharacterized prospective cohort of pregnant Peruvian women, to describe the association of maternal early-pregnancy vaginal microbiome signatures, determined using 16S rRNA gene sequence-based methods, with PTB. Our study adds to the growing literature suggesting modifications of the association between changes in the vaginal microbiota during pregnancy and risk of PTB by race/ethnicity.

#### Materials and Methods

#### Study population

The sample for the present study was drawn from participants enrolled in the Pregnancy Outcomes, Maternal and Infant Study (PrOMIS) Cohort who provided vaginal swabs (N=785) between October 2013 and May 2014. Details of the PrOMIS cohort have been described previously (19). Briefly, the study population consists of women attending prenatal care clinics at the Instituto Nacional Materno Perinatal (INMP) in Lima, Peru. Women who initiated prenatal care prior to 16 weeks' gestation were eligible; if they were younger than 18 years of age, did not speak and read Spanish, or had completed more than 16 weeks' gestation they were excluded. Enrolled consenting participants were interviewed by trained research personnel using a structured questionnaire to elicit information regarding maternal socio-demographic, lifestyle characteristics, and medical and reproductive histories. All participants provided written informed consent. The institutional review boards of the INMP, Lima, Peru and the Harvard School of Public Health Office of Human Research Administration, Boston, MA approved all procedures used in this study.

Of the 785 selected participants, 35 women spontaneously delivered or had premature rupture of membranes and delivered at less than 37 weeks of gestation. After excluding women with multiple pregnancies, stillbirth, medical complications of pregnancy including pre-eclampsia, a total of 25 PTB cases (gestational age at delivery < 37 completed weeks) remained for microbiome analyses. A total of 529 women had term delivery, single live birth and no medical complications (i.e., pre-eclampsia and no placental abruption). Randomly sampled 100 women who delivered at term ( 37 weeks of gestation; mean  $\pm$  SD = 39.0  $\pm$  1.0) were selected as term controls (ratio of 4:1). The 100 participants selected for this analysis did not differ when compared to all participants in the PrOMIS cohort.

#### Sample collection

Maternal vaginal swabs were self-collected using (i) dry Dacron sterile polyester (Starplex Scientific Starswab II Collection and Transport Systems) and (ii) ESwab (Copan Liquid Amies Elution Swab Collection and Transport System) swabs at 9 weeks of gestation, on average. The ESwab swabs were placed in the ESwab tube containing 1ml of modified Liquid Amies solution. The swabs were immediately stored on ice and transported to the laboratory for storage at  $-80^{\circ}$ C prior to processing. The second swab was used to create a vaginal smear on the glass slide for BV analysis.

#### Definition of preterm birth

We defined PTB according to the American College of Obstetricians and Gynecologists (ACOG) guidelines (20). Gestational age was determined using the last menstrual period and confirmed by ultrasound examination, conducted prior to 20 weeks of gestation. Using information collected from maternal medical records, we categorized PTB cases according to the three pathophysiological groups previously described (i.e., spontaneous PTB, preterm premature rupture of membranes, and medically induced PTB) (21,22). Women who delivered prior to 37 completed weeks of gestation as a result of medical intervention were not eligible for this study.

#### Sequencing

The 16S rRNA gene V4 variable region PCR primers 515/806 with barcode on the forward primer were used in a 30 cycle PCR using the HotStarTaq Plus Master Mix Kit (Qiagen, USA) under the following conditions: 94°C for 3 minutes, followed by 28 cycles of 94°C for 30 seconds, 53°C for 40 seconds and 72°C for 1 minute, after which a final elongation step at 72°C for 5 minutes was performed. After amplification, PCR products were checked in 2% agarose gel to determine the success of amplification and the relative intensity of bands. Multiple samples were pooled together (*e.g.*, 100 samples) in equal proportions based on their molecular weight and DNA concentrations. Pooled samples were purified using calibrated Ampure XP beads. Then the pooled and purified PCR products were used to prepare DNA libraries by following Illumina TruSeq DNA library preparation protocol. Sequencing was performed at MR DNA (www.mrdnalab.com, Shallowater, TX, USA) on a MiSeq following the manufacturer's guidelines. Reagent controls using certified DNAfree water were run through library preparation and PCR and did not generate libraries. For quality control, samples submitted for sequencing were done at MR DNA.

#### **Bioinformatics**

Reads were demultiplexed using idemp and then trimmed of adapters, quality-trimmed, and quality-filtered using DADA2. Of 8,811,003 total reads, 8,320,983 passed quality filtering. Error rates were learned on a subset of the samples and used to infer sequence variants separately for each run, then paired ends were merged. Runs were then merged, chimeras were removed, and taxonomy was assigned using the Silva v132 database (23) (Supplemental Methods). Technical replicates were visually examined for differences (Supplemental Figure 2). For a single sample sequenced in triplicate, one replicate did not match the other two replicates and was excluded from further analysis. All other replicates were similar to each other and counts from replicates were summed. We removed any amplicon sequence variants (ASVs) that were not bacterial and collapsed ASVs assigned to the same species together. We conducted diversity analyses on rarefied and unrarefied samples. For the community state type (CST) and ALDEX2 analyses, we filtered phyla occurring in <1 sample on average and ASVs present at < 00.5% relative abundance in every sample.

#### Statistical analysis

We created Dirichlet multinomial mixture models using R v3.3.2 and the DirichletMultinomial v1.6.0 package (24) to assign all samples to CSTs. We determined the number of CSTs by comparing the Laplace approximation of the negative log models and identifying the point at which an increase in Dirichlet components resulted in minor reductions in model fit. We compared the results of the community state typing to results from a complete linkage hierarchical clustering method using Euclidian distances on the matrix of microbe relative abundances.

We used logistic models to test the association between PTB and CST, controlling for parity and Mestizo ethnicity, as these factors may influence vaginal microbiota and risk of preterm delivery. To test if individual taxa were differentially abundant between term and preterm

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samples, we used R v3.3.2 and the ALDEX2 package (25). Logistic models and ALDEX2 analyses were performed on the entire sample as well as separately among those sampled before 12-weeks' gestation (N=55) and those sampled at 12- to 16-weeks' gestation (N=69). As sensitivity analyses, we 1) included a parameter modeling dispersion for these models and 2) excluded non-Mestizo individuals due to a lack of non-Mestizo cases sampled at 12- to 16-weeks' gestation (Supplemental Tables 5–8). We calculated measures of multiplicative and additive effect modification (Supplemental Tables 9–11) (26,27). Additionally, we examined key dominating *Lactobacillus sp.* for patterns of exclusion with *Gardnerella sp.*, as suggested by Callahan *et al.* (13), stratified by gestational age at sampling.

#### Results

#### Study population

At an alpha=0.05, cases and controls were not statistically significant for any patient demographic or microbial features in the unstratified analysis (Table 1). Only 24.0% of cases were educated beyond high school, while 47.0% of controls were (p=0.075). Additionally, 8.00% of cases were underweight in early pregnancy, while no controls were (p=0.066).

Mothers sampled at or after 12- to 16-weeks' gestation were slightly younger than mothers sampled before 12-weeks' gestation, with respective mean ages of 26.9 vs 29.6 (p = 0.019). No other differences were statistically significant (Supplemental Table 1). Cases sampled at or after 12-weeks' gestation were less likely to be educated beyond high school than controls (10.0% vs 53.3%, p=0.018). The same trend existed in those sampled before 12-weeks' gestation, but the difference was not statistically significant (p=0.562). All cases among non-Mestizo women had vaginal samples from before 12-weeks' gestation (Supplemental Table 2).

#### **Microbial diversity**

When considered altogether, there were no differences in alpha diversity measures by case status. After stratifying by trimester of microbiome assessment, cases had lower alpha diversity than controls among those sampled at or after 12-weeks' gestation (respective mean Shannon 1.01 vs 1.49, p=0.053) – regardless of whether samples were rarefied (Figure 1). The same relationship held when limiting the sample to Mestizo women (Supplemental Figure 3). Microbial communities did not cluster together by PTB status or gestational age at sampling on an NMDS plot of Bray-Curtis distances (Supplemental Figure 4).

#### Community state types

Three CSTs emerged from Dirichilet multinomial modeling. These included 1) a more diverse CST, 2) a CST dominated by a *Lactobacillus* species (hereafter referred to as *Lactobacillus* ASV2) and 3) a CST dominated by *L. iners* (Figure 2). *Lactobacillus* ASV2 was identified as either *L. acidophilus* or *L. crispatus* by a BLAST search.

#### Microbial characteristics by subject and swab characteristics

In the unstratified sample, only classification using the Hay-Ison criteria was associated with CST (p<0.001), with more individuals in the diverse CST classified as intermediate or BV

(Supplemental Table 3). The same association with Hay-Ison criteria existed in both strata of gestational age at swab. Among those sampled at or after 12-weeks gestation, more unplanned pregnancies existed in the *L. iners*-dominated CST than in other CSTs (p=0.01) (Supplemental Table 4).

#### Association with PTB

Overall, no CST was associated with PTB in crude or adjusted logistic models (Table 2). When stratified by timing of microbiome assessment, there was a marginal association (p<0.10) with the *Lactobacillus*-ASV2-dominated CST in the fully adjusted (OR 4.65, 95% CI: (0.81, 29.96)) model (Table 3). An effect modification analysis suggests the presence of effect-measure modification on the multiplicative (Ratio of ORs, *Lactobacillus* ASV2 dominated vs diverse CST (95% CI): 10.41 (1.21, 101.18); p=0.04, *L. iners* dominated vs diverse CST (95% CI): 9.47 (0.86, 129.05); p=0.07) but not additive scale (Supplemental Tables 9–11).

#### Alternative clustering technique

In dendrograms showing clustering and accompanying heatmaps showing composition, CSTs and the hierarchical clustering technique clustered samples similarly (Figure 2). Samples collected during 12- to 16-weeks' gestation – but not those collected before 12-weeks gestation – clustered by CST and preterm status.

#### Joint distribution of key taxa

We examined the joint distribution of *Lactobacillus* species with *Gardnerella* species. Consistent with the analysis by Callahan *et al.*, we observed that *Gardnerella* species displayed exclusionary patterning with *L. crispatus* and a co-occurring pattern with *L. iners* (13). In our sample, *Lactobacillus* ASV2 appeared to have an exclusionary pattern with *Gardnerella* (Supplemental Figure 7).

#### Individual taxa

No taxa associated with PTB in unstratified or stratified analysis after Benjamini-Hochberg correction for multiple testing. Prior to correction for multiple testing, two ASVs were associated (p<0.05) in the first trimester (Supplemental Figures 8–9).

#### Discussion

We conducted a 16S rRNA gene taxonomic screen characterizing the vaginal microbiome during the first and early second trimester of gestation among 25 PTB cases and 100 term controls sampled from a well characterized cohort of pregnant Peruvian women. We identified three community states: one dominated by *L. iners*, one by another *Lactobacillus* species and one more diverse. Vaginal microbial communities did not associate with PTB overall. The direction of associations between *Lactobacillus*-dominated communities and PTB differed between women sampled at different gestational ages. The finding that vaginal microbiomes do not associate with PTB is consistent with some results of studies conducted among non-Caucasian women (2,13). Thus, our results support the hypothesis that

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*Lactobacillus*-dominated community types are not universal indicators of a healthy pregnant vaginal microbiome in all populations.

The types of vaginal microbial communities in our sample are similar to those reported elsewhere, including communities dominated by *Lactobacillus* species and more diverse communities. The Peruvian women in our sample have vaginal microbiota more similar to African American and Hispanic US women than to Caucasian or Asian women (28,29).

In the unstratified analysis, we found no association between vaginal communities and PTB. This contradicts previous literature suggesting a protective association between *Lactobacillus*-dominated vaginal communities and PTB (13–15). However, studies among non-Caucasian women have reported either weaker or null associations of *Lactobacillus*-dominated communities with PTB (2,13,30). In a primarily African American cohort, Romero *et al.* reported no associations of microbial CSTs with PTB (2). Callahan *et al.* found no statistically significant differences in relative abundances of *Lactobacillus* or *Gardnerella* by term status in a cohort of predominately African American women although they did report statistically significant difference of *L. crispatus* (13). Among a mixed cohort of both African American and Caucasian women, Fettweis *et al.* reported term women had higher abundances of *L. crispatus* than preterm women, but when stratified by race, these differences were greater among Caucasian women than among African American women (18). Vaginal microbiota and PTB rates differ by race and geographic locale; the association between the vaginal microbiota and PTB also appears to differ, and race/locale should be considered in evaluations of this association.

In our study, *Lactobacillus*-dominated communities had an inverse association with PTB among women swabbed before 12 weeks' but a direct association among those swabbed at or after 12 weeks' gestation. We observed effect modification on the multiplicative scale. These findings fit with observations in longitudinal studies – for example, Stout *et al.* found greater decreases in vaginal microbiome diversity over pregnancy in women with PTB than term birth (17) and Fettweis *et al.* found increases in *L. crispatus* abundance over the course of pregnancy among African American women who delivered preterm (18). However, our analysis was post-hoc, taking advantage of variation in timing of vaginal swab collection and we lacked repeated measures of the vaginal microbiome over pregnancy. Therefore, we cannot disentangle causal from noncausal mechanisms of the observed effect heterogeneity. It is possible that the women sampled before 12 weeks' are not exchangeable with those sampled at or after 12 weeks' gestation. Although we controlled for important confounding factors, we cannot exclude the possibility of residual confounding by unmeasured variables such as administration of vaginal progesterone during pregnancy or placement of cervical cerclage.

Our study has other limitations that should also be considered. Our negative controls had very low biomass and were not sequenced. Thus, we cannot assess low-level contaminants. However, low-level contamination is unlikely to have severely affected our CSTs, which were characterized by typical, high-abundance vaginal organisms. Additionally, we could not confidently assign a species level identification to the *Lactobacillus* sequence dominating our second community. Confidence intervals in the stratified analysis were large,

due in part to the relatively small sample size – sample size may have impacted our power to detect differences. Future studies exploring the association between serial measures of vaginal microbiome across pregnancy and risk of PTB are warranted.

Our study has several strengths. First, our study was conducted in a well-characterized Peruvian cohort, and is one of only a handful of such studies in Latin America; the results highlight similarities and differences in pregnant vaginal microbiomes in different countries. Second, the determination of vaginal microbiomes collected during the first and early-second trimester of gestation served to clarify the temporal relationship between changing microbiome community characteristics and subsequent risk of PTB. Third, our use of high-throughput 16S rRNA gene sequence-based methods for microbial profiling allowed for simultaneously investigating the entire microbial community.

In conclusion, in this cohort of Peruvian women, a *Lactobacillus*-dominated CST did not appear protective for PTB. We found no association between microbial communities and PTB but did observe potential effect heterogeneity between vaginal communities and PTB by gestational age at microbiome assessment. Our findings may indicate the importance of considering race/ethnicity, geographic locale, and timing of vaginal sampling in studies of PTB and vaginal microbiomes.

#### Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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#### List of Abbreviations

РТВ	Preterm birth
BV	Bacterial vaginosis
16S rRNA	16 subunit ribosomal ribonucleic acid
PrOMIS	Pregnancy Outcomes, Maternal and Infant Study
INMP	Instituto Nacional Materno Perinatal
CST	Community state type
ASV(s)	Amplicon Sequence Variant(s)

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Figure 1: Alpha diversity of vaginal communities in pregnant women who delivered <37 weeks (n=25) or at term (n=100) both unstratified and stratified by gestational age at vaginal swab (<12 weeks 15 preterm birth, 54 term births; 12 weeks 10 preterm births, 45 term births) Violin plots showing the Shannon diversity of vaginal swabs by term status both when unstratified and stratified by gestational age at gestational swab. Violins show distribution of Shannon diversity when microbial samples have **A**) not been rarefied to even depth and **B**) have been rarefied to even depth. Means shown as large, inverted triangles.

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A) Sampled before 12 weeks gestational age. B) Sampled at or after 12 weeks gestational age to 16 weeks gestational age

## Figure 2: Dendogram clustering method compares well to CST clustering; samples cluster by CST and preterm status in swabs from at or after 12 weeks to 16 weeks' gestational age but only by CST in swabs taken before 12 weeks' gestational age

Heatmap showing correlations between bacterial oligotypes and individual samples, with a dendogram derived from a Euclidian matrix clustering technique on the left-hand side. Dendogram clustering is in accordance with Dirichlet multinomial derived community state types (colored bar under the dendrogram) in both trimesters of sampling, however, swabs

only cluster by preterm status (shown in black on bar directly on the heatmap) in the second trimester swabs.

#### Table One:

Prevalence of selected socio-demographic, medical and reproductive health variables by preterm birth status in a sample of Peruvian women

	Term N=100 N(%) or Mean (sd)	Preterm N=25 N(%) or Mean (sd)	p-value
Community state type:			0.811
Diverse	50 (50.0%)	12 (48.0%)	
Lactobacillus ASV2 dominated	26 (26.0%)	8 (32.0%)	
Lactobacillus iners dominated	24 (24.0%)	5 (20.0%)	
Gestational age at swab:			0.791
< 12 weeks	54 (54.5%)	15 (60.0%)	
> or $= 12$ to 16 weeks	45 (45.5%)	10 (40.0%)	
Shannon Diversity	1.35 (0.73)	1.17 (0.72)	0.283
Maternal age	27.9 (6.15)	30.1 (7.37)	0.165
Maternal age (categories):			0.808
18 to 19	6 (6.00%)	1 (4.00%)	
20 to 29	57 (57.0%)	12 (48.0%)	
30 to 34	19 (19.0%)	6 (24.0%)	
35 and older	18 (18.0%)	6 (24.0%)	
Education:			0.075
>12th grade	47 (47.0%)	6 (24.0%)	
7th to 12th grade	48 (48.0%)	18 (72.0%)	
< or = 6th grade	5 (5.00%)	1 (4.00%)	
Mestizo:			0.432
No	26 (26.0%)	4 (16.0%)	
Yes	74 (74.0%)	21 (84.0%)	
Married:			0.349
No	23 (23.0%)	3 (12.0%)	
Yes	77 (77.0%)	22 (88.0%)	
Employment:			0.964
No	41 (41.0%)	11 (44.0%)	
Yes	59 (59.0%)	14 (56.0%)	
Trouble paying for basics:			0.754
No	50 (50.0%)	11 (44.0%)	
Yes	50 (50.0%)	14 (56.0%)	
Planned pregnancy:			0.349
No	50 (51.0%)	16 (64.0%)	
Yes	48 (49.0%)	9 (36.0%)	
Early pregnancy BMI:			0.066
<18.5	0 (0.00%)	2 (8.00%)	
18.5–24.9	47 (47.0%)	11 (44.0%)	
25–29.9	35 (35.0%)	6 (24.0%)	
> or = 30	17 (17.0%)	5 (20.0%)	

	Term N=100 N(%) or Mean (sd)	Preterm N=25 N(%) or Mean (sd)	p-value
Missing	1 (1.00%)	1 (4.00%)	
Nulliparous:			1.000
Parous	46 (46.5%)	12 (48.0%)	
Nulliparous	53 (53.5%)	13 (52.0%)	
Bacterial vaginosis (Hay-Ison criteria):			0.669
Ι	15 (15.0%)	6 (24.0%)	
Missing	3 (3.00%)	0 (0.00%)	
Ν	56 (56.0%)	14 (56.0%)	
VB	26 (26.0%)	5 (20.0%)	

The second CST's dominating organism - labeled ASV2 - was identified as either L. acidophilusor L. crispatus by a BLAST search.

#### Table 2:

Results of logistic regression for preterm birth status (Odds ratios and 95% CI) in a sample of Peruvian women

	Model 1 <sup><i>a</i></sup> OR (95% CI) <sup><i>d</i></sup> 25 cases / 100 controls	Model 2 <sup>b</sup> OR (95% CI) <sup>d</sup> 25 cases / 99 controls	Model 3 <sup><i>c</i></sup> OR (95% CI) <sup><i>d</i></sup> 25 cases / 99 controls
<i>Lactobacillus</i> ASV2 <sup><i>e</i></sup> dominated (reference Diverse community)	1.28 (0.45, 3.5)	1.25 (0.43, 3.49)	1.27 (0.44, 3.56)
<i>L. iners dominated</i> (reference Diverse community)	0.87 (0.25, 2.64)	0.85 (0.25, 2.59)	0.87 (0.25, 2.68)

<sup>a</sup>Unadjusted

 $b_{\mbox{Adjusted}}$  for parity status (one individual missing parity status)

<sup>C</sup>Adjusted for parity and Mestizo status (one individual missing parity status)

<sup>d</sup>Profile likelihood-based confidence intervals reported

<sup>e</sup>The second CST's dominating organism - labeled ASV2 - was identified as either *L. acidophilus* or *L. crispatus* by a BLAST search.

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# Table 3:

Results of logistic regression for preterm birth status stratified by gestational age at vaginal swab (Odds ratios and 95% CI) in a sample of Peruvian women

		Sampled < 12 weeks' gestat	tion	Samp	oled >12 weeks to 16 weeks' ge	station
	Model 1 <sup>d</sup> OR (95% CI) <sup>d</sup> 15 cases / 54 controls	Model 2 <sup>b</sup> OR (95% CIJ <sup>d</sup> 15 cases / 53 controls	Model 3 <sup>c</sup> OR (95% CJ) <sup>d</sup> 15 cases / 53 controls	Model 1 <sup>d</sup> OR (95% CI) <sup>d</sup> 10 cases / 45 controls	Model 2 <sup>b</sup> OR (95% CI) <sup>d</sup> 10 cases / 45 controls	Model 3 <sup>c</sup> OR (95% CI) <sup>d</sup> 10 cases / 45 controls
Lactobacillus ASV2 dominated <sup>e</sup> (reference Diverse community)	0.49 (0.12, 1.78)	0.49 (0.12, 1.82)	0.49 (0.11, 1.81)	$5.33^{T}(0.97, 32.91)$	5.06 <sup>T</sup> (0.9, 31.91)	$4.65^{T}(0.81, 29.96)$
<i>L. iners dominated</i> (reference Diverse community)	0.33 (0.05, 1.54)	0.31 (0.04, 1.45)	0.31 (0.04, 1.45)	2.80 (0.45, 17.45)	2.71 (0.43, 17.02)	3.48 (0.52, 23.92)
$T_{\mathrm{p<0.10}}$						
<sup>a</sup> Unadjusted						
$b_{ m Adjusted}$ for parity status	(one individual missing par	rity status; one individual mis	ssing gestational age at swab			
$^{\mathcal{C}}$ Adjusted for parity and M	lestizo status (one individua	al missing parity status; one ii	ndividual missing gestationa	l age at swab)		
$^d$ Profile likelihood-based $^c$	confidence intervals reported	q				

<sup>e</sup>The second CST's dominating organism - labeled ASV2 - was identified as either *L. acidophilus* or *L. crispatus* by a BLAST search.