

1 **Illumina sequencing analysis of the ruminal microbiota in high-yield** 2 **and low-yield lactating dairy cows**

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8 **Abstract**

9 In this study, differences in the ruminal bacterial community between high-yield and
10 low-yield lactating dairy cows fed the same diets were investigated. Sixteen lactating
11 dairy cows with similar parity were divided into two groups based on their milk yield:
12 high-yield (HY) and low-yield (LY) groups. On day 21, rumen content samples were
13 collected, and the microbiota composition was determined using Illumina MiSeq
14 sequencing of the 16S rRNA gene. During the study period, dry matter intake (DMI)
15 and milk yield were measured daily, and milk composition was assessed 3 times per
16 week. The results showed that the milk of the LY group tended to have higher fat
17 ($P=0.08$), protein ($P=0.01$) and total solid ($P=0.04$) contents than that of the HY
18 group, though the HY group had higher ruminal acetate ($P=0.05$), propionate
19 ($P=0.02$) and volatile fatty acid (VFA) ($P=0.02$) concentrations. Principal coordinate
20 analysis indicated significant differences in ruminal bacterial community composition
21 and structure between the HY group and LY group. Overall, Bacteroidetes (HY
22 group: $52.91\pm 3.06\%$; LY group: $61.88\pm 3.03\%$) was the predominant phylum,
23 followed by Firmicutes (HY group: $41.10\pm 2.74\%$; LY group: $32.11\pm 2.97\%$). The
24 abundances of *Ruminococcus 2*, Lachnospiraceae and *Eubacterium coprostanoligenes*
25 were significantly higher in the HY group than in the LY group. In addition, 3
26 genera—*Anaerostipes*, *Bacteroidales* and *Anaeroplasma*—were identified as
27 biomarker species with the greatest impacts on the ruminal community structure in the

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28 LY group. These findings facilitate the understanding of bacterial synthesis within the
29 rumen and reveal an important mechanism underlying differences in milk production
30 in dairy cows.

31 **Key words: bacterial community, 16S rRNA, rumen, dairy cows**

32 **Introduction**

33 A symbiotic relationship exists with regard to the rumen microbiota of cattle. The
34 rumen is a highly specialised organ of ruminant animals that promotes a community
35 of mutualistic microbial species while simultaneously absorbing nutrients derived
36 from digestion of plant fibre and cellular material [1]. In dairy cows, the rumen
37 microbial community plays a critical role in the volatile fatty acid (VFA) production,
38 B-vitamin synthesis, and microbial protein biosynthesis, which are critical for the
39 animal's well-being and efficient milk production [2]. Moreover, the structure of the
40 bacterial community has been correlated with the production traits [3], production
41 variables [4-7], and milk production and composition [8] of dairy cows. It has been
42 reported that rumen microbial dynamics involve both core and variable microbial
43 components [9-11]. In addition, similar to the microbial community in the gut of non-
44 ruminants, the structure and function of the microbial community in the cow rumen
45 are shaped by dynamic physical, chemical, and predatory environments. In turn, the
46 microbial community regulates nutrient cycling to the host [12]. However, a more in-
47 depth comparison is warranted to improve our understanding of differences in rumen
48 bacterial community composition between high-yield and low-yield dairy cows.

49 Recent efforts to study the rumen microbiome have focused on identifying and
50 quantifying ruminal microbial communities [8, 13]. As a powerful molecular
51 approach for taxonomic analyses, the application of 16S rRNA gene sequencing
52 technology has provided novel insight into the microbiome ecology of gastrointestinal
53 tracts [14, 15]. Indeed, this technique has been widely used to study microbial
54 diversity and the metabolic capabilities of microbiomes in different ecological niches
55 [16], fermented food [17, 18], waste-water treatment facilities [19], and human and
56 animal gastrointestinal tracts [20-22]. The objective of the present study was to
57 examine differences in ruminal bacterial community compositions between high-yield

58 and low-yield lactating cows.

59 **Materials and Methods**

60 **Animals and Experimental Design**

61 The experimental protocol was approved by the Institutional Animal Care and Use
62 Committee at the Beijing University of Agriculture, in compliance with regulations
63 for the administration of affairs concerning experimental animals (The State Science
64 and Technology Commission of P. R. China, 1988). According to the principle of
65 parity and lactation days, 16 Holstein lactating dairy cows of similar parity were used
66 and assigned to a high-yield group (average production 31.90 ± 1.76 kg/d, mean \pm SD)
67 or a low-yield group (average production 19.30 ± 1.76 kg/d), with 8 each. The test
68 period was 21 d, with a pre-feeding period of 14 d and a treatment period of 7 d.
69 These lactating dairy cows were the fed same diet, the composition of which is shown
70 in Table 1.

71 **Table 1 Ingredients and nutrient composition (% of DM) of the basal diet**

Item	Content
Ingredient, % of DM	
Alfalfa hay	6.90
Corn silage	46.32
Oat grass	2.40
Ground corn	9.88
Soybean meal	5.10
Steam-flaked corn	4.40
DDGS ¹	4.40
Corn bran	3.70
Extruded soybean	3.00
Barley	2.66
Wheat barn	2.66
Sodium cyclamate	2.40
Oat	1.50
Canola meal	1.07
Cottonseed meal	1.07
Magalac ²	0.90
NaHCO ₃	0.59
Limestone	0.48
NaCl	0.27

Premix ³	0.30
Nutrient composition ⁴	
CP	17.4
NDF	31.1
ADF	16.6
Ether extract	5.00
Ca	0.78
P	0.44
NE _L , Mcal/kg	1.76

72 ¹DDGS=dried distillers grain with solubles.

73 ²Church and Dwight Co. Inc., Princeton, NJ.

74 ³Formulated to provide (per kg of DM) 4,560 mg of Cu, 3,000 mg of Fe, 12,100 mg of Zn, 4,590
75 mg of Mn, 60 mg of Co, 200 mg of Se, 270 mg of I, 10,000 IU of vitamin E, 450,000 IU of
76 vitamin D, 2,000,000 IU of vitamin A, and 3,000 mg of nicotinic acid.

77 ⁴Chemical composition is based on chemical analysis of the total mixed ration (TMR), as
78 described.

79 **Rumen fluid sampling and parameter measurement**

80 Rumen fluid samples were collected from the oral cavity at 3-4 h after the
81 morning feeding on day 7. The rumen contents were strained through 4 layers of
82 cheesecloth with a mesh size of 250 μ m. Ruminal pH was immediately measured
83 using a portable pH meter (Testo 205, Testo AG, Germany). The filtered rumen fluid
84 samples were centrifuged at 10,000 \times g for 15 min at 4°C, aliquoted into 5-mL
85 cryopreservation tubes, frozen in liquid nitrogen tank and stored at -80°C for analysis
86 of the ruminal bacterial community. Another 10 mL of clear supernatant samples was
87 mixed with 2 mL of 250 g/L of metaphosphoric acid and stored at -20°C for VFA
88 determination, as described by Pan et al. [23].

89 **DNA extraction and polymerase chain reaction (PCR) amplification**

90 Microbial DNA was extracted from rumen fluid samples using E.Z.N.A.®
91 Bacterial DNA Kit (Omega Bio-Tek, Norcross, U.S.) according to the manufacturer's
92 protocols. The yield and purity of the extracted DNA were assessed with a NanoDrop
93 1000 instrument (NanoDrop, Wilmington, DE).

94 **16S rRNA analysis**

95 The V3-V4 regions of the 16S ribosomal RNA gene were amplified by PCR (95°C
96 for 3 min, followed by 27 cycles at 95°C for 30 s, 55°C for 30 s, and 72°C for 45 s
97 and a final extension at 72°C for 10 min) using the primers 338F 5'-barcode-
98 ACTCCTACGGGAGGCAGCAG)-3' and 806R 5'-
99 GGACTACHVGGGTWTCTAAT-3', where the barcode is an eight-base sequence
100 unique to each sample. The PCR reactions were performed in triplicate in a 20-µL
101 mixture containing 4 µL of 5 × FastPfu Buffer, 2 µL of 2.5 mM deoxyribonucleotide
102 triphosphates (dNTPs), 0.8 µL of each primer (5 µM), 0.4 µL of FastPfu Polymerase,
103 0.2 µL of bovine serum albumin (BSA) and 10 ng of the template DNA. Amplicons
104 were excised from 2% agarose gels and purified using AxyPrep DNA Gel Extraction
105 Kit (Axygen Biosciences, Union City, U.S.) according to the manufacturer's
106 instructions and then quantified using QuantiFluor™ -ST (Promega, U.S.). Purified
107 amplicons were pooled in equimolar ratios and pair-end sequenced (2 × 300) on the
108 Illumina MiSeq platform according to standard protocols. The raw reads were
109 deposited into the NCBI Sequence Read Archive (SRA) database (Accession
110 Number: SRP136923).

111 The raw fastQ files were quality filtered by Trimmomatic and merged by
112 FLASH under the following criteria. First, the reads were truncated at any site
113 receiving an average quality score of <20 over a 50-bp sliding window. Second,
114 sequences with overlapping segments longer than 10 bp were merged according to
115 their overlapping region, with a mismatch of no more than 2 bp. Finally, sequences of
116 each sample were separated according to barcodes (exactly matching) and
117 primers (allowing 2 nucleotide mismatching), and reads containing ambiguous bases
118 were removed.

119 Operational taxonomic units (OTUs) were clustered with a 97% similarity cut-
120 off using UPARSE (version 7.1 <http://drive5.com/uparse/>) with a novel 'greedy'
121 algorithm that simultaneously performs chimera filtering and OTU clustering. The
122 taxonomy of each 16S rRNA gene sequence was analysed according to the RDP
123 Classifier algorithm (<http://rdp.cme.msu.edu/>) against the Silva (SSU123) 16S rRNA
124 database using a confidence threshold of 70%.

125 **Statistical analysis**

126 Data were analysed with a mixed-model procedure (SAS Institute, Inc., Cary,
127 NC), and Duncan's multiple comparison tests were employed to assess differences
128 between means. Differences were considered statistically significant when $P<0.05$
129 and considered a trend when $P<0.10$.

130 **Results**

131 **Dry matter intake, milk yield, and milk composition**

132 Dry matter intake (DMI) was significantly greater in the high-yield (HY) group
133 than in the low-yield (LY) group ($P=0.03$). Milk production (19.3 ± 1.76 and 31.9 ± 1.76
134 kg/d, respectively; $P<0.01$), 4% fat-corrected milk (FCM) (18.95 ± 1.73 and
135 29.20 ± 1.73 kg/d, respectively. $P<0.01$) and energy-corrected milk (ECM)
136 (21.07 ± 1.93 and 32.09 ± 1.93 kg/d, respectively; $P<0.01$) were significantly lower in
137 the LY group than in the HY group (Table 2). The milk fat content tended to be
138 higher ($P=0.08$) (Table 2), and the milk protein content was significantly higher in the
139 LY group than in the HY group ($P<0.01$). No difference was observed in milk lactose
140 content between the LY and HY groups ($P=0.21$; Table 2). Fat, protein and lactose
141 yields were significantly greater in the HY group than in the LY group (Table 2).
142 However, somatic cell count (SCC) was not different between the HY and LY groups
143 ($P=0.13$; Table 2).

144 **Table 2. Milk and ECM from high-yielding and low-yielding dairy cows during the entire**
145 **sampling period ¹**

Items	LY	HY	SEM	<i>P</i> -value
Milk production (kg/d)	19.3	31.9	1.76	<0.0001
4%FCM production (kg/d) ²	18.95	29.20	1.73	<0.0001
ECM production (kg/d) ³	21.07	32.09	1.93	<0.0001
Milk composition				
Fat %	4.02	3.48	0.28	0.0788
Fat yield (kg/d)	0.75	1.10	0.07	0.0004
Protein %	3.50	3.07	0.11	0.0023

Protein yield (kg/d)	0.66	0.98	0.06	0.0002
Lactose %	4.87	5.05	0.14	0.2127
Lactose yield (kg/d)	0.92	1.61	0.10	<0.0001
Total solid content %	13.15	12.30	0.38	0.0417
SCC (log ₁₀)	2.46	3.10	2.78	0.1339

146 ¹Data are presented as least squares means.

147 SCC=somatic cell count.

148 **Ruminal pH and VFA concentrations**

149 Rumen pH was not different between the HY group and the LY group (Table 3).
 150 NH₃-N (mg/dL) was greater in the HY group than in the LY group ($P<0.01$), and
 151 there was a significant increase in acetate, propionate and butyrate levels in the HY
 152 group relative to the LY group ($P<0.05$).

153 In addition, total VFA levels were significantly greater in the HY group than in the
 154 LY group ($P=0.02$). A lower trend was observed for the acetate:propionate ratio in the
 155 HY group compared to the LY group ($P=0.06$).

156 **Table 3. Effects of differences between high-yielding and low-yielding dairy cows on**
 157 **metabolites in the rumen**

Items	LY	HY	SEM	<i>P</i> -value
pH	6.73	6.71	0.02	0.69
NH ₃ -N, mg/dL	7.99	13.28**	1.03	0.01
Molar proportion				
Acetate	62.19	68.97*	1.78	0.05
Propionate	21.94	26.35**	0.97	0.02
Isobutyrate	0.83	0.84	0.03	0.93
Butyrate	12.01	14.23**	0.45	0.01
Isovalerate	1.22	1.48	0.07	0.08
Valerate	1.57	1.76	0.06	0.14
Acetate:propionate ratio	2.85	2.64	0.06	0.06
Total VFA, mM	99.76	113.63	3.14	0.02

158 * $P<0.05$; ** $P<0.01$: Values within a sampling day followed by superscripted asterisks differ.

159 SEM=standard error of the mean.

160 **Diversity and richness of microbial communities**

161 In total, 2,382,338 merged sequences were acquired for the 16 samples from the dairy

162 cows, and 1,191,169 high-quality sequences, with an average read length of 440 bp,
163 were classified as bacterial. On average, at least 54,144 sequences were obtained per
164 sample, and greater than 99% depth coverage was achieved. The rarefaction curve
165 generated tended to plateau, showing that the number of OTUs did not rise with an
166 increasing volume of data. This finding showed that the data volume of sequencing
167 was reasonable. The results of this study show that the sequencing data were
168 reasonable and could reflect changes in most bacterial flora (Figure 1).

169 No significant differences were observed in alpha diversity index results between
170 the HY and LY groups ($P>0.05$) (Table 4). However, the coverage of the HY group
171 was significantly higher than that of the LY group ($P<0.01$), indicating greater
172 community diversity for the HY group.

173

174

175 **Table 4. Alpha diversity index of rumen bacteria**

Item	LY	HY	SEM	<i>P</i> -value
Sobs	1196.13	1214.88	17.21	0.60
Shannon	5.4104	5.4852	0.04	0.42
Simpson	0.01	0.01	0.00	0.74
ACE	1375.65	1360.65	18.75	0.70
Chao	1378.64	1376.82	20.10	0.97
Coverage	0.9921	0.9938**	0.00	0.001

176 * $P<0.05$; ** $P<0.01$: Values within a sampling day followed by superscript asterisks differ.

177 SEM=standard error of the mean;

178 Principal coordinate analysis (PCoA) results showed that the HY group was
179 distinct from the LY group (Figure 2). Principal coordinates 1 and 2 accounted for
180 24.94% and 12.25%, respectively, of the total variation.

181 Twenty-one bacterial phyla were identified across all samples. Bacteroidetes,
182 Firmicutes and Proteobacteria were the three dominant phyla, representing 57.59%,
183 35.86%, and 1.53%, respectively, of the total sequences (Figure 3). Thus, at the
184 phylum level, Bacteroidetes and Firmicutes were particularly dominant. The HY
185 group exhibited a greater abundance of Firmicutes and lower abundance of

186 Bacteroidetes than did the LY group ($P<0.01$), whereas Proteobacteria was less
187 abundant ($P<0.05$).

188 At the genus level, taxa with a relative abundance of $\geq 1\%$ in at least one sample were
189 further analysed, and the relevant genera are presented in Figure 4 and Figure 5.
190 Twenty-one genera were identified, 6 of which exhibited significantly different
191 abundances between the groups. Specifically, 4 genera were more abundant in the HY
192 group at $P<0.01$, including *Ruminococcaceae-NK4A214-group*, *Ruminococcus 2*,
193 *Lachnospiraceae-BS11-gut-group*, and *[Eubacterium]-coprostanoligenes-group*, and
194 2 were more abundant in the HY group at $P<0.05$: *Succiniclasticum* and
195 *Christensenellaceae-R-7-group*.

196 **Correlations between bacterial communities and ruminal variables**

197 As shown in Figure 6, the relative abundances of the genera *Bacteroides* and
198 *Ruminococcus 2* were positively correlated with ruminal propionate and $\text{NH}_3\text{-N}$
199 concentrations ($r>0.4$, $P<0.05$) but negatively correlated with the ruminal ratio
200 (acetate:propionate ratio) ($r<-0.4$, $P<0.05$). In addition, *norank_o__Mollicutes_RF9*
201 was positively correlated with ruminal acetate and VFA concentrations ($r>0.4$,
202 $P<0.05$). *Candidatus-Saccharimonas* was positively correlated with the ruminal
203 propionate concentration ($r>0.4$, $P<0.05$) but negatively correlated with the ruminal
204 ratio ($r<-0.4$, $P<0.05$). Moreover, the ratio was negatively correlated with *Schwartzia*
205 ($r<-0.6$, $P<0.05$).

206 **Discussion**

207 High-throughput sequencing has been widely used in studies of microbial flora in
208 ruminants as a means of quickly and efficiently determining the microbial community
209 structure of the rumen [24]. Differences in rumen microbiota between high- and low-
210 yield dairy cows can therefore be characterised using high-throughput sequencing
211 methods. The present study also linked rumen fluid VFAs with milk components and
212 rumen microbes.

213 **Changes in rumen fermentation parameters and milk composition**

214 Higher values for rumen fermentation parameters and milk composition were found in

215 the HY group compared to the LY group. This finding suggests that due to host–
216 microbiota interactions, different cows may harbour different microbial species
217 compositions, which are closely related to distinct differences in rumen fermentation
218 parameters and milk composition. Furthermore, recent findings suggest an important
219 relationship between VFAs and milk components [2, 25, 26]. Specifically, of the three
220 principle VFAs, acetic and butyric acids are substrates for oxidation and are
221 precursors of lipids [27, 28]. Propionic acid is the only glucogenic VFA, accounting
222 for 65-80% of the net glucose supply in lactating dairy cows [29, 30]. In a previous
223 study, milk yield was most highly related to rumen concentrations of butyrate and
224 propionate [31]. In the present study, propionate and butyrate concentrations as well
225 as fat, protein and lactose yields were significantly greater in the HY group than in the
226 LY group, which is consistent with previous research [32]. The NH₃-N concentration
227 in rumen fluid can reflect the balance of protein degradation and synthesis under
228 varying feed conditions. NH₃-N is an intermediate product of feed protein, non-
229 protein nitrogen degradation and microbial protein synthesis, and it is mainly affected
230 by feed protein degradation, rumen wall absorption, microorganism utilisation and
231 rumen chyme outflow rate [33-35]. Yang et al. [36] reported that the concentration of
232 NH₃-N should be higher than 5 mg/dL; otherwise, it will influence the "uncoupling"
233 effect of ruminal fermentation and reduce the efficiency of microbial protein
234 synthesis. According to our results, the NH₃-N concentration was within the normal
235 range, though that in the HY group was significantly higher than that in the LY group.
236 These results indicate that rumen microbes promote protein degradation, providing a
237 better understanding of difference in milk proteins between the two groups.

238 **Differences in rumen microbial composition between HY and LY groups**

239 No differences were observed in bacterial community richness and diversity between
240 the groups. Three phyla predominated in both groups, which was consistent with
241 previous studies reporting that the principal phyla of microbes in the rumen are
242 Bacteroidetes, Firmicutes, and Proteobacteria. The proportions of these three phyla
243 account for approximately 94% of the total [35, 37, 38]. Interestingly, our results
244 showed that the abundance of Firmicutes in the HY group was higher than that in the

245 LY group, though the abundances of the two other dominant phyla were lower in the
246 former than in the latter.

247 As previously described by Pan et al. [23], cows fed a high proportion of grain have a
248 higher abundance of Firmicutes and a lower abundance of Proteobacteria than control
249 cows, and other studies have shown that feeding a high amount of grain can promote
250 milk production [39, 40]. Thus, the present study provides a better understanding of
251 why cows fed the same diet can have different milk production. The present findings
252 further demonstrate that Firmicutes plays an important role in milk production.

253

254 In agreement with other research results [11, 41], *Prevotella* was the most abundant
255 genus in all samples. Although *Prevotella* was more abundant in the LY group than in
256 the HY group, the difference was not significant. In contrast, *Ruminococcaceae*-
257 *NK4A214*-group, *Ruminococcus* 2, *Lachnospiraceae*-*BS11*-gut-group and
258 [*Eubacterium*]-*coprostanoligenes*-group were significantly different between the two
259 groups, with higher abundances in the HY group than in the LY group. Jiang et al.
260 [42] reported that the increase in the relative abundance of *Ruminococcus* partly
261 explains why adding live yeast to the diet increases the in vivo digestibility of DM
262 and NDF and the performance of cows. This result illustrates that high-performance
263 cows have higher abundances of *Ruminococcus* in the rumen fluid, which is
264 consistent with the present research results. Members of the family Lachnospiraceae
265 are gram-positive obligate anaerobes that are mostly non-spore-forming bacteria [43,
266 44]. Huws et al. [45] showed that Ruminococcaceae and Lachnospiraceae play
267 predominant roles in biohydrogenation pathways within the rumen. As the primary
268 succinate-utilising bacterial taxon, *Succiniclasticum* accounted for 7.45% of the total
269 bacterial community in the HY group, with significantly greater abundance than in the
270 LY group. A higher level of *Succiniclasticum* has been associated with greater
271 production of succinate from starch degradation [46]. Moreover, the abundances of
272 Christensenellaceae and Ruminococcaceae NK4A214 in the HY group were
273 significantly higher than in the LY group, though little information about these two
274 genera has been reported in the literature. The reasons for the altered status of genera

275 in cows with different milk production are unclear.

276 **Conclusion**

277 In summary, high-yield dairy cows have better ruminal fermentation patterns than do
278 low-yield cows, which was partially attributed to the greater abundances of
279 *Bacteroides*, *Ruminococcus* 2, *Ruminococcaceae* NK4A214, Lachnospiraceae,
280 *Succinivlasticum*, *Eubacterium* and *Christensenella* in the former. Furthermore,
281 rumen fermentation in high-yield cows exhibited higher VFA levels than that found in
282 low-yield cows. Rumen microbial composition between high-yield and low-yield
283 dairy cows differs, and microbial species diversity and distribution contribute to
284 production-related phenotypes. Overall, our findings enhance our understanding of
285 rumen bacteria in cows with different milk yields and provide new strategies for
286 improving dairy cow production performance.

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295 and analysis of the samples.

296

297 Figure 1. The rarefaction curve of sequencing based on OTUs¹.

298 ¹OTUs, operational taxonomic units.

299 Figure 2. Principal coordinate analysis (PCoA) of bacterial community structures of the ruminal
300 microbiota in the high-yielding group (green circles) and the low-yielding group (red triangles).

301 PCoA plots were constructed using the unweighted UniFrac method.

302 Figure 3. Percent composition of predominant phyla in the rumen.

303 Figure 4. Percent composition of genera in the rumen.

304 Figure 5. Percent composition and significance of genera in the rumen.
305 Figure 6. Correlation analyses between the relative abundances of bacteria genera and ruminal
306 fermentation parameters. Only genera with abundances significantly associated with ruminal
307 VFA, propionate and acetate concentrations are presented. Green represents a negative correlation
308 between the abundance of the species and the ratio ($r < -0.4$), and red represents a positive
309 correlation ($r > 0.4$, $0.01 < P \leq 0.05$ *; $0.001 < P \leq 0.01$ **; $P \leq 0.001$ ***; Values with a significant
310 correlation followed by superscripted asterisks differ).

311

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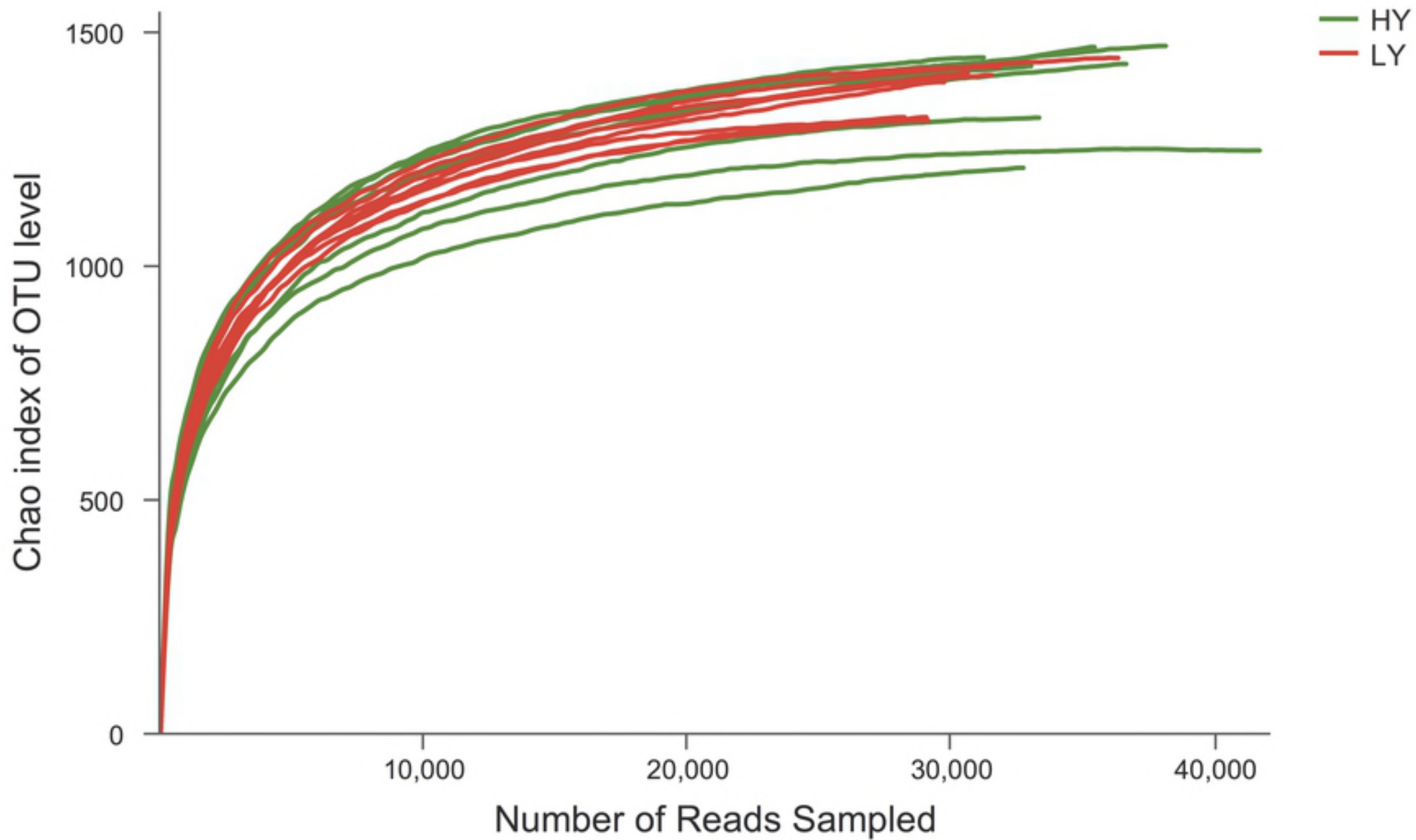
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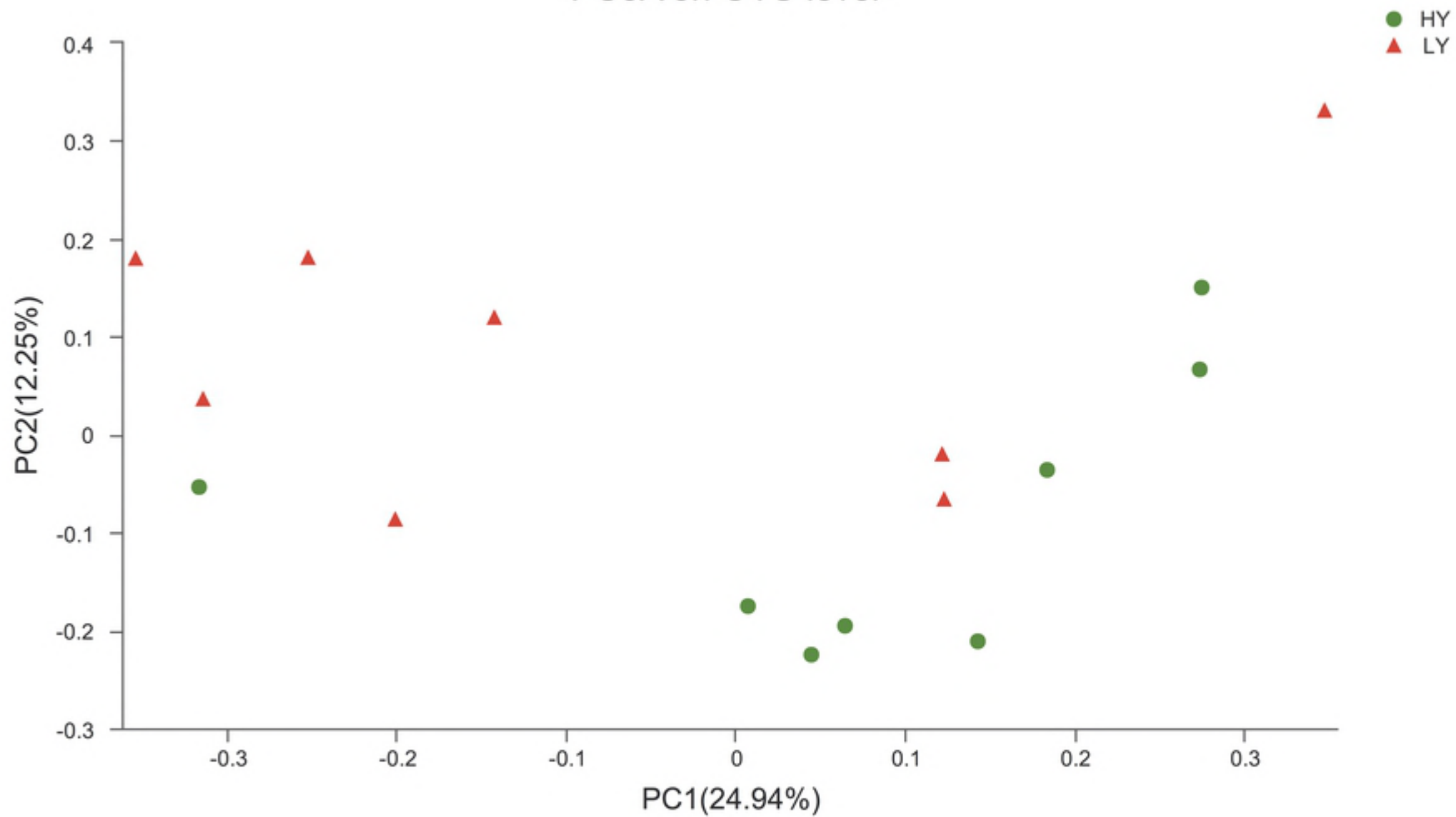
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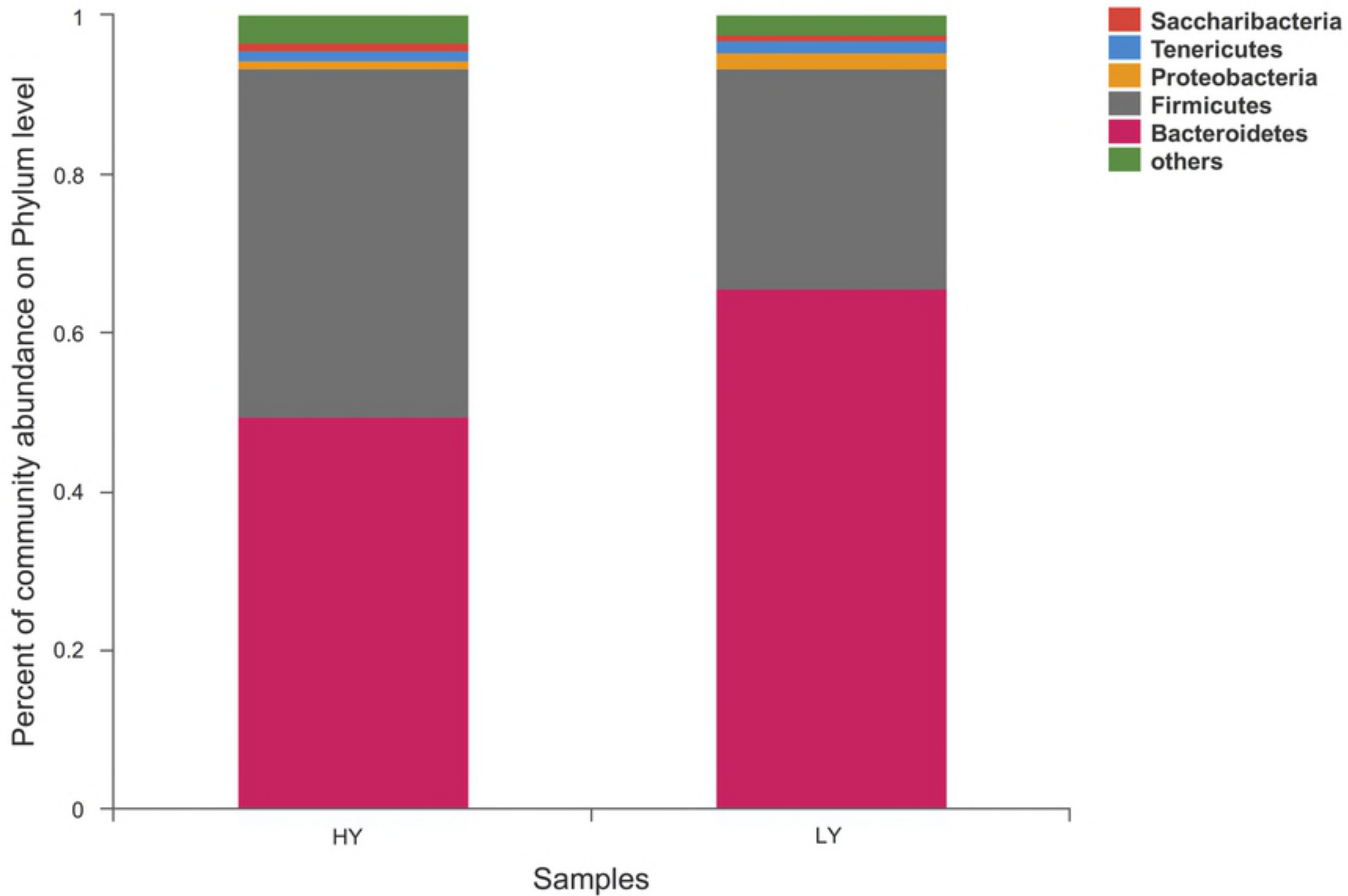
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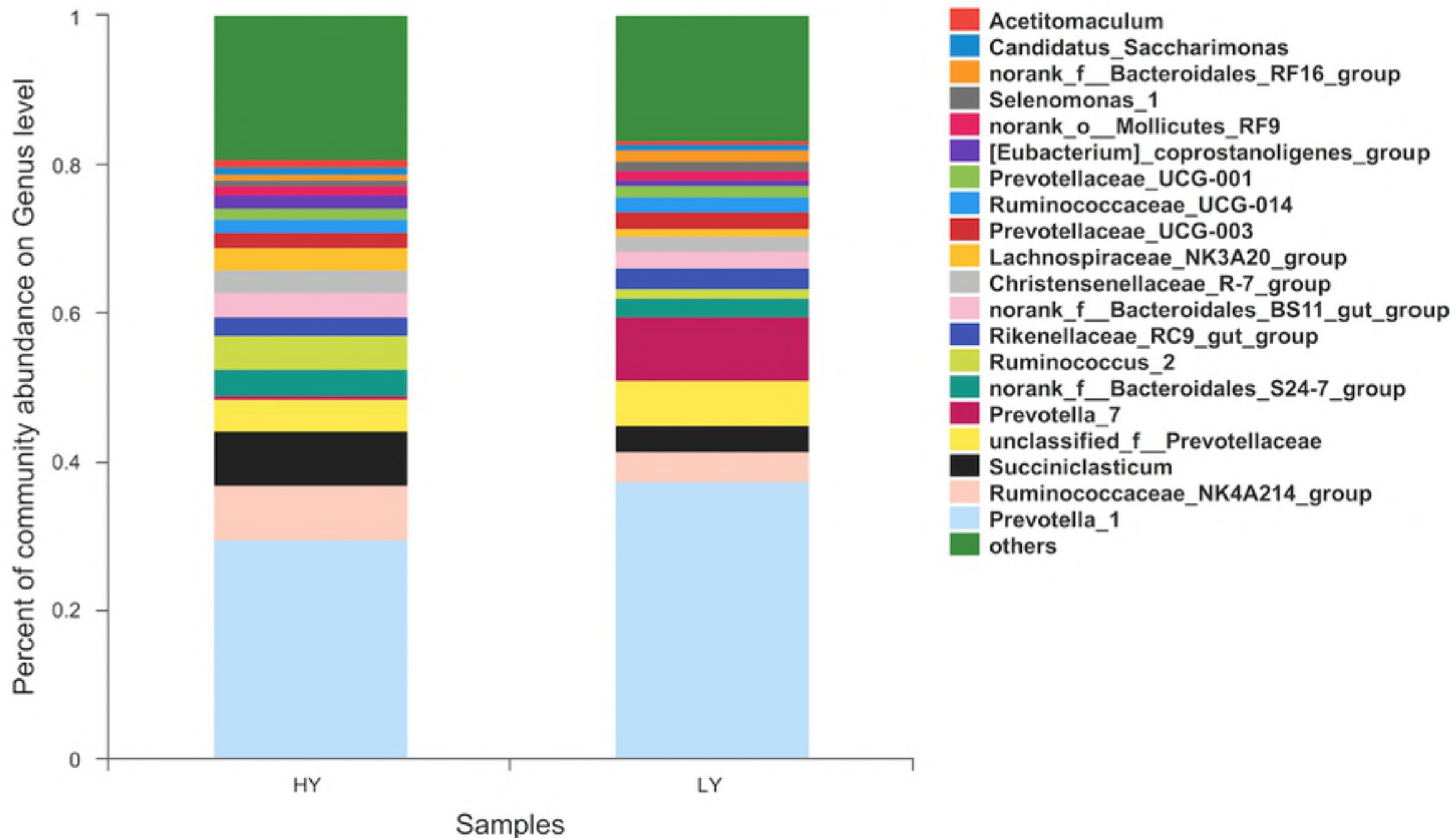
PCoA on OTU level



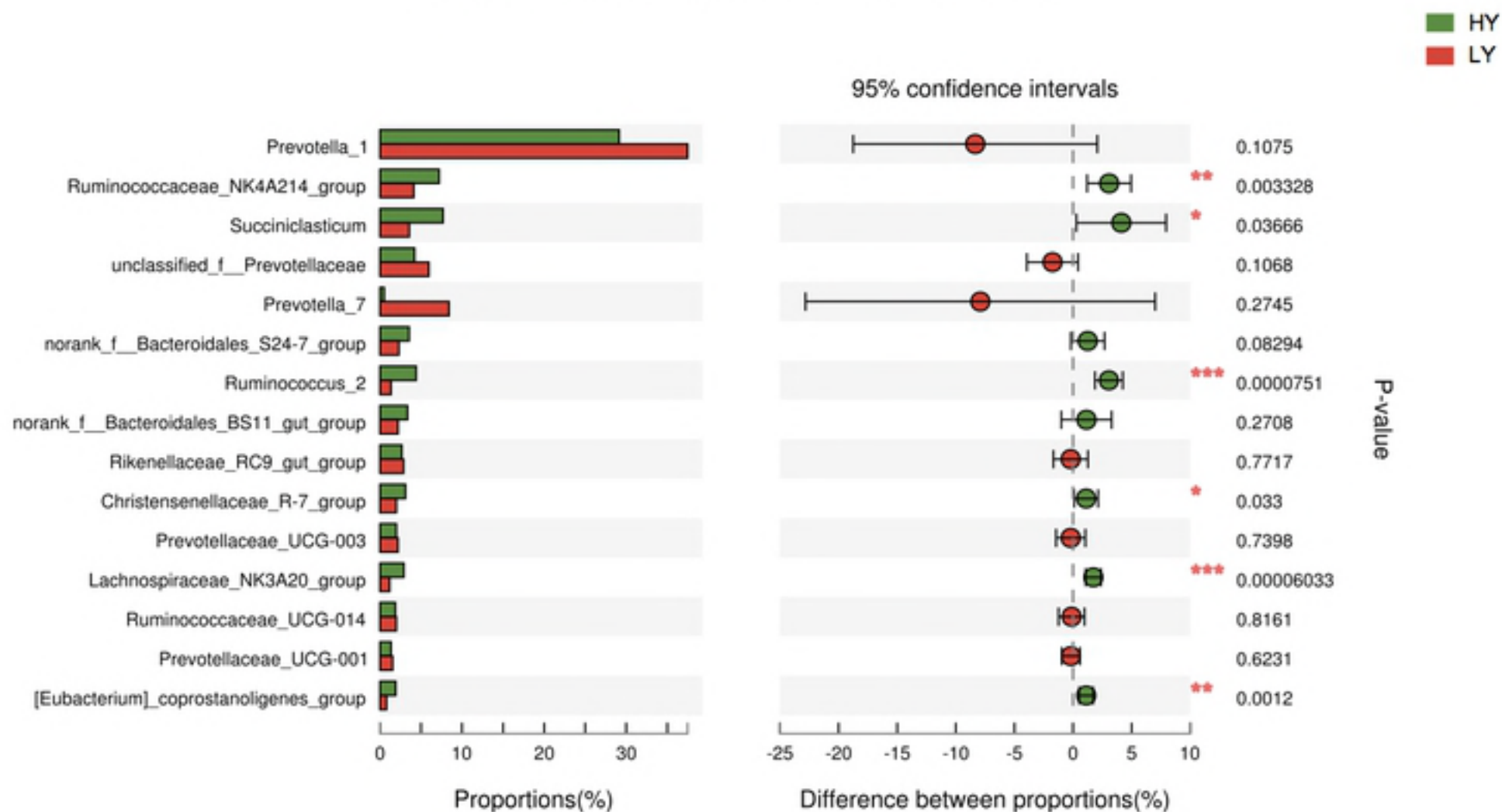
Community barplot analysis



Community barplot analysis



Student's t-test bar plot on Genus level



Pearson Correlation Heatmap

