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JAST (Journal of Animal Science and Technology) TITLE PAGE
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| ARTICLE INFORMATION | Fill in information in each box below |
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| Article Type | Research article |
| Article Title (within 20 words without abbreviations) | Crude protein levels adjusted by Distiller's dried grains with solubles reshape rumen microbiota in Hanwoo steers during early fattening period |
| Running Title (within 10 words) | DDGS-adjusted CP alters rumen microbiota structure |
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| Competing interests | No potential conflict of interest relevant to this article was reported. |
| Funding sources State funding sources (grants, funding sources, equipment, and supplies). Include name and number of grant if available. | This study was supported by the Cooperative Research Program for Agriculture Science and Technology Development (Project No. RS-2020-RD009319), Rural Development Administration, Republic of Korea. The funders played no role in this study or in the preparation of the manuscript. |
| Acknowledgements | Not applicable. |
| Availability of data and material | Full-length 16S rRNA sequences were deposited in the NCBI SRA under BioProject PRJNA1244067. All datasets analyzed in the present study are available from the corresponding author upon request. |
| Authors' contributions Please specify the authors' role using this form. | Conceptualization: Seo JK, Seo SW. Data curation: Kim HB. Formal analysis: Kim HB, Cho HJ. Methodology: Kim HB, Cho HJ. Software: Kim HB. Validation: Moon JB, Park TS. Investigation: Moon JB. Writing - original draft: Kim HB. Writing - review & editing: Seo JK, Seo SW, Cho HJ, Park TS, Moon JB, Kim HB. |
| Ethics approval and consent to participate | The use of animals and protocols for this experiment was reviewed and approved by the Chungnam National University Animal Research Ethics Committee (202103A-CNU-027). |

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8 **Abstract**

9 Distiller's dried grains with solubles (DDGS), a by-product typically used in cattle diets as a protein source, is a
10 promising feed ingredient for CH₄ mitigation because of its high ether extract level. This study investigated how
11 increasing levels of crude protein (CP) adjusted by DDGS affect rumen microbiota in relation to CH₄ mitigation and
12 animal productivity. A total of 24 Hanwoo steers in the early fattening period (16 months old, 504 ± 33.0 kg) were
13 studied over 16 weeks, including a 2-week adaptation period. Tall fescue hay and four concentrate mixes were used
14 as experimental diets: 15% CP in dry matter (DM) (low CP [LCP]), 18% CP (lower middle CP [LMCP]), 19% CP
15 (higher middle CP [HMCP]), and 21% CP (high CP [HCP]). The rumen microbiota was analyzed using full-length
16 16S rRNA sequencing. Dietary CP levels did not significantly alter alpha diversity, whereas beta diversity, based on
17 the weighted UniFrac distance, showed clear separation between the LCP and HCP groups. Among the major taxa,
18 18 bacterial taxa were differentially abundant among the treatments, and 22 showed linear associations with dietary
19 CP levels. Notably, *Selenomonas dextrinosolvens*, the unclassified species Gammaproteobacteria, *Ruminobacter*
20 *amylophilus*, and *Lentimicrobium saccharophilum* exhibited a negative linear association with dietary CP levels,
21 whereas the unclassified species Bacteroidales and *Eubacterium ventriosum* showed a positive linear association.
22 The predicted KEGG modules related to amino acid biosynthesis were enriched in LCP compared to HCP and were
23 negatively associated with increasing CP levels. The unclassified species Gammaproteobacteria and *L.*
24 *saccharophilum* were negatively correlated with one or more CH₄ measurements. Dietary CP levels adjusted by
25 DDGS supplementation influenced shifts in rumen bacterial composition and had functional implications in Hanwoo
26 steers during the early fattening period. Specifically, certain bacterial taxa related to lipid metabolism and predicted
27 metabolic functions related to amino acid biosynthesis were linearly associated with dietary CP levels as adjusted by
28 DDGS. This study provides a valuable insight into how dietary CP levels adjusted by DDGS shape rumen microbial
29 communities and their predicted functional profiles, with potential implications for optimizing CP utilization in
30 Hanwoo steers.

31 **Keywords:** Crude protein; DDGS; Rumen microbiota; Methane mitigation; Animal productivity, Hanwoo steer

Introduction

32
33 Hanwoo is a native breed of Korean cattle renowned for its superior meat quality, particularly marbling (1). To
34 produce high-quality meat, the Hanwoo beef industry generally utilizes long-term fattening periods, which can be
35 divided into two periods: an early fattening period (at 13–21 months of age) and a late fattening period (at 22–29
36 months of age) (2). The emerging focus on shortening the fattening period is driven by several factors, including
37 reduction in GHG emissions, lower production costs, and shifts in consumption trends (3). The early fattening
38 period is a crucial stage marked by significant muscle development and a notable increase in the average daily gain
39 (ADG) (2). Several studies have reported improvements in growth performance with a high-crude protein (CP) diet.
40 Xia, Rahman (4) reported a significant positive effect on ADG and gain-to-feed ratio in Holstein bulls. In addition,
41 Jeong, Seong (5) reported improved ADG and carcass quality grade in late-fattening Hanwoo steers fed high levels
42 of CP.

43 Enteric methane (CH_4) emissions from ruminants represent both an environmental concern and a loss of feed
44 energy, thereby reducing production efficiency in cattle (6-8). Consequently, dietary strategies have been explored
45 to mitigate CH_4 emissions while improving animal performance. Among these, distiller's dried grains with solubles
46 (DDGS), a by-product of the bioethanol industry, have gained attention due to their high level of CP content (an
47 average of 30%) and ether extract (EE) content (7–17%), which may influence rumen fermentation and microbial
48 composition (9-12). Several previous studies have evaluated the potential CH_4 mitigation potential of including
49 DDGS at up to 40% DDGS in ruminant rations and consistently reported a reduction in CH_4 production (13-16).
50 Taken together, these findings suggest that supplementation of ruminant rations with DDGS is a promising strategy
51 for CH_4 mitigation in animal husbandry.

52 The rumen is an extremely anaerobic environment in which digestion and fermentation of ingested feed occur and
53 are orchestrated by diverse rumen microbiota. Dietary changes can alter rumen microbiota and fermentation patterns
54 (17, 18). Therefore, the investigation of shifts in rumen microbiota using high-throughput sequencing techniques
55 plays a pivotal role in linking our understanding of the relationship between dietary alterations and growth
56 performance. Although there is substantial evidence supporting the reduction of CH_4 through the inclusion of DDGS
57 in ruminant diets, there remains a scarcity of data regarding the influence of DDGS and elevated dietary protein
58 levels on CH_4 production and the composition of rumen microbiota.

59 A previous feeding trial showed that increasing dietary CP levels through DDGS supplementation improved ADG
60 and reduced CH₄ yield (ppm/kg of dry matter intake [DMI]) and CH₄ intensity (ppm/kg of ADG) during the early
61 fattening period in Hanwoo steers (19). Based on these findings, we hypothesized that increasing CP levels adjusted
62 by DDGS would alter rumen microbial composition and associated metabolic functions, potentially contributing to
63 the observed changes in CH₄ and ADG. Therefore, the objective of this study was to evaluate the effects of
64 increasing dietary CP levels in the concentrate mix on rumen microbiota and their predicted functional profiles using
65 full-length 16S rRNA sequencing.

66
67

68 **Materials and Methods**

69 *Animals, diets, and procedures*

70 The use of animals and protocols for this experiment were reviewed and approved by the Chungnam National
71 University Animal Research Ethics Committee (202103A-CNU-027). The feeding trial was conducted at the Center
72 for Animal Science Research, Chungnam National University, Korea, and detailed information regarding animal
73 management, chemical analysis of feed ingredients, and details of sample collection have been reported previously
74 (19). Briefly, 24 Hanwoo steers in the early fattening period (16 months old, 504 ± 33.0 kg of BW) were used in this
75 experiment. Steers were grouped according to their initial BW and breeding values for carcass weight and arranged
76 in a completely randomized block design (20). The feeding experiment lasted for 16 weeks, including a 2-week
77 adaptation period. Tall fescue hay and four concentrate mixes were used as the experimental diets. The experimental
78 concentrate mixes comprised four different levels of CP: 15% CP of dry matter (DM) (low CP [LCP]), 18% CP of
79 DM (lower middle CP [LMCP]), 19% CP of DM (higher middle CP [HMCP]), and 21% CP of DM (high CP
80 [HCP]). Diets were formulated to meet nutrient requirements according to Korean feeding standards for Hanwoo
81 steers during the early fattening period (2). The CP content was adjusted primarily through DDGS supplementation,
82 which inherently alters both protein and lipid content. To minimize differences in dietary lipid levels, hydrogenated
83 fat was added to the formulations, resulting in comparable EE content across experimental concentrate mixes. The
84 diet formulation and estimated chemical composition of the experimental diets are presented in Table 1 and
85 Supplemental Table 1, respectively. All Hanwoo steers were fed concentrate diets twice daily at 08:00 and 18:00,
86 while forage and drinking water were provided ad libitum throughout the experiment.

87

88 *Collection of rumen fluid and DNA extraction*

89 Rumen fluid was collected three times on three consecutive days (day 1, 14:00; day 2, 11:00; and day 3, 07:00)
90 using an oral stomach tube (21). Briefly, the initially obtained rumen fluid (approximately 200 mL) was discarded,
91 and 500 mL of rumen fluid was collected. The collected rumen fluid was transferred to the laboratory for further
92 analysis. Following this, the rumen fluid (2 mL) was centrifuged at $20,000 \times g$ for 20 min at 4°C , and the remaining
93 pellet was stored at -80°C until DNA extraction. Microbial genomic DNA was extracted according to the
94 manufacturer's protocol (QIAamp Fast DNA Stool Kit, Hilden, Germany), with a bead-beating step (22). Briefly,
95 the ruminal pellet was mixed with 1 mL of InhibitEX buffer and sterile zirconia beads (0.3 g of 0.1 mm and 0.1 g of
96 0.5 mm). The mixture was then homogenized for 20 min using a Vortex-Genie 2 homogenizer (Scientific Industries
97 Inc., Bohemia, NY, USA). The samples were heated at 70°C for 5 minutes and subsequently at 95°C for 5 min.
98 The remaining steps were performed according to the manufacturer's recommendations. After DNA extraction,
99 quantity and quality were measured using a NanoDrop (ND-200, Allsheng, Hangzhou, China). The purified DNA
100 was stored at -20°C until 16S rRNA gene sequencing.

101

102 *Full-length 16S rRNA gene sequencing*

103 Sequencing libraries were prepared following the PacBio amplicon template preparation and sequencing protocols
104 to amplify the region between 27F and 1492R within the 16S rRNA gene, using a primer pair with symmetric
105 barcoded adapters (27F: 5'-AGRGTTYGATYMTGGCTCAG-3' and 1492R: 5'-RGYTACCTTGTTACGACTT-3')
106 (23, 24). The first amplification was carried out with an initial denaturation at 94°C for 5 min, followed by 35
107 cycles consisting of denaturation at 94°C for 30 s, annealing at 53°C for 30 s, and extension at 72°C for 90 s,
108 concluding with a final elongation at 72°C for 5 min. The resulting amplicons were purified using AMPure beads
109 (Agencourt Bioscience, Beverly, MA, USA). DNA concentration was measured using Quant-IT PicoGreen
110 (Invitrogen), and its quality was evaluated with a TapeStation D5000 Screen Tape (Agilent Technologies,
111 Waldbronn, Germany). For PacBio Sequel library preparation, pooled amplicon DNA (500 ng) was used. Library
112 preparation was performed using a PacBio SMRTbell Expert Template Prep Kit 2.0 (Pacific Biosciences, Menlo
113 Park, CA, USA). SMRTbell templates were annealed using Sequel II Bind Kit 2.1 (Pacific Biosciences, Menlo Park,
114 CA, USA). The Sequel II Sequencing Kit 2.0 (Pacific Biosciences, Menlo Park, CA, USA) and SMRT cells 8M
115 Tray (Pacific Biosciences, Menlo Park, CA, USA) were used for sequencing. The data per sample were captured for
116 each SMRT cell with a 10 h movie time on the PacBio Sequel sequencing platform by Macrogen (Seoul, Korea).

117 The following procedures adhered to the PacBio Sample Net-Shared Protocol, which can be accessed at
118 <http://pacificbiosciences.com/>.

119

120 *Metataxonomic analysis of rumen microbiota*

121 Barcode sequences were trimmed using Cutadapt (Version 4.1) (25). A general metataxonomic analysis was
122 performed based on Quantitative Insights into Microbial Ecology 2 (QIIME2, Version 2024.2) (26). Briefly, the
123 divisive amplicon denoising algorithm 2 (DADA2) plugin was used to remove primer sequences, denoise low-
124 quality reads (Q score < 25), and eliminate chimeric sequences (Supplemental Table 2). Amplicon sequence variants
125 (ASVs) were taxonomically classified based on the National Center for Biotechnology Information (NCBI) 16S
126 rRNA gene database, which was constructed following the RESCRIPt protocol (27). Alpha diversity, including the
127 Chao1 estimate, observed ASVs, Faith's phylogenetic diversity, evenness, and Shannon and Simpson indices, was
128 assessed based on the rarefied ASV tables using randomly selected 1,263 ASVs per sample. The rarefaction depth
129 was selected based on sequencing depth distribution across samples to retain sufficient reads while minimizing
130 sample loss, and was confirmed to be adequate for capturing rumen microbial diversity as indicated by the saturation
131 of rarefaction curves (Supplemental Figure 1). The overall ruminal microbiota shaped by different levels of dietary
132 CP was compared using principal coordinate analysis (PCoA) based on unweighted and weighted UniFrac distance
133 matrices and visualized using the Plotly package in R (version 4.2.1). The number of shared and unique bacterial
134 taxa at the phylum and species levels were visualized using the VennDiagram package in R (version 4.2.1). For
135 taxonomic analysis, only taxa present in $\geq 30\%$ of all rumen samples were defined as core bacterial taxa and were
136 primarily evaluated in this study.

137

138 *Prediction of functional profiles*

139 Functional profiles of the rumen microbiota were inferred from full-length 16S rRNA gene sequences using
140 phylogenetic investigation of communities by reconstruction of unobserved states 2 (PICRUSt2, version 2.5.0) (28).
141 Predictions were based on ASV-level data and the corresponding feature (biological observation) table.
142 Subsequently, the predicted metabolic functions were mapped to the Kyoto Encyclopedia of Genes and Genomes
143 (KEGG) orthologs and modules using the manually curated KEGG BRITE database. Principal component analysis
144 (PCA) was conducted to assess differences in predicted KEGG orthologs based on Bray–Curtis dissimilarities across
145 varying dietary CP levels and was visualized using the ggfortify package in R (29).

146

147 *Statistical analysis*

148 The examination of variable normality was conducted using the Shapiro–Wilk test using the UNIVARIATE
149 procedure in SAS 9.4 (SAS Institute Inc., Cary, NC, USA). Data from the metataxonomic analysis, which did not
150 exhibit a normal distribution after several transformations, including log, square root, and arcsine, were analyzed
151 using the non-parametric Kruskal–Wallis rank sum test, utilizing the Kruskal–Wallis test function in the stats
152 package in R (version 4.2). If a statistical trend was observed (Kruskal–Wallis $P < 0.10$), Dunn’s post hoc test with
153 the Benjamini–Hochberg adjustment (false discovery rate [FDR]- P) using the DunnTest function in the FSA
154 package was conducted. Microbiome multivariate association with linear models (MaAsLin2) was performed using
155 compound Poisson linear models with default parameters to assess the linear association of microbiota and KEGG
156 modules with increasing CP levels (30). Permutational multivariate analysis of variance (PERMANOVA) was used
157 to analyze the statistical differences in the PCoA and PCA results among treatments with 9,999 random
158 permutations in QIIME2 and R, respectively. Spearman correlation coefficients between rumen microbiota and
159 animal performance including growth, rumen fermentation, blood metabolite, and CH₄ parameters reported in the
160 previous study (19) were computed using the microbiome package in R and visualized using the ggplot2 package in
161 R. Statistical significance was set at $P < 0.05$, and a statistical tendency was considered at $0.05 \leq P \leq 0.10$.

162

163

Results

164 *Changes in animal performance*

165 Growth performance and feed intake were obtained from the associated feeding trial (19). Briefly, DMI, including
166 both concentrate and forage, did not differ significantly among treatments ($P > 0.10$), whereas crude protein intake
167 increased linearly with increasing dietary CP levels ($P < 0.001$). In addition, increasing dietary CP levels through
168 DDGS supplementation tended to increase ADG ($P = 0.068$) and significantly decreased CH₄ yield (ppm/kg DMI; P
169 = 0.014) and CH₄ intensity (ppm/kg ADG; $P = 0.008$).

170 *Changes in alpha and beta diversity by dietary crude protein level*

171 One steer in the LMCP group was excluded from the experiment because of health-related issues. In total,
172 225,648 reads were obtained from 23 Hanwoo steers, with an average of $9,811 \pm 3,215$ reads per sample
173 (Supplemental Table 2). After denoising and quality filtering based on the DADA2 plugin, an average of $4,097 \pm$
174 1865 reads were retained, with a total of 94,222 reads (Supplemental Table 2), which resulted in greater than 95.3%

175 of Good's coverage for all samples (data not shown). The rarefaction curves of alpha diversity measurements,
176 including Chao1, observed ASVs, Faith's phylogenetic diversity, evenness, Shannon index, and Simpson index,
177 almost approached the saturation plateau, indicating that the sequence depth for rarefaction was adequate
178 (Supplemental Figure 1). Various levels of dietary CP did not lead to notable alterations in any of the alpha diversity
179 measurements of rumen microbiota (Figure 1 and Table 2). PCoA based on the weighted UniFrac distance
180 demonstrated a significant impact of the dietary CP level on rumen microbiota (Figure 2B, $P = 0.0293$), especially
181 between the LCP and HCP groups (pairwise comparison, Q -value = 0.0132), whereas there were no significant
182 differences based on the unweighted UniFrac distance (Figure 2A, $P = 0.1976$).

183

184 *Bacterial community composition*

185 The shared and unique microbiota at the phylum and species levels are shown in Figure 3 (A and B). At the
186 phylum level, eight phyla were common to all treatments, whereas unique phyla were observed exclusively in the
187 LCP and HCP groups (Figure 3A). At the species level, 50 of the 112 species (44.6%) were shared among all
188 treatments. The number of unique species observed exclusively in the LCP, LMCP, HMCP, and HCP groups was
189 six, eight, six, and seven, respectively. However, none of these unique species were considered part of the core
190 microbiota, as their occurrence was below 30% across the samples (Figure 3B).

191 Figure 3 (C and D) shows the distribution of major core phyla and core species present in $\geq 30\%$ of samples,
192 with an average relative abundance greater than 0.5%. Regardless of the dietary treatment, the most dominant
193 phylum was Bacteroidota, comprising an average of 76% of each community, while Bacillota was the second most
194 abundant phylum, representing an average of 16.4% (Figure 3C). At the species level, 47 of the 112 species were
195 identified as core species, representing an average of 96.7% of the community (Figure 3D). *Prevotella ruminicola*
196 and *Prevotella brevis* were the predominant species, constituting approximately 50% of the total population (Figure
197 3D).

198

199 *Changes in rumen microbiota by dietary crude protein level*

200 Eighteen bacterial taxa were identified as differentially abundant between the dietary CP levels using the
201 Kruskal–Wallis test with Dunn's post hoc analysis, demonstrating at least a statistical tendency (Figure 4A and
202 Supplemental Table 3). At the phylum level, Bacteroidota showed a significantly higher relative abundance in the
203 HCP group than in the LCP group (Figure 5B, $P = 0.0433$), whereas Pseudomonadota exhibited a significantly

204 higher relative abundance in the LCP group than in the HCP group (Figure 4B, $P = 0.0129$). The relative abundance
205 of the Bacteroidales lineage from the class to the species level was significantly enriched in the HCP group, whereas
206 the *Succinivibrio dextrinosolvens* lineage from the phylum to the species level was significantly enriched in the
207 LCP group (Figure 4 and Supplemental Table 3).

208 A linear association between rumen microbiota and dietary CP levels was identified using MaAsLin2 (Figure
209 5). The analysis detected 23 linear associations from the phylum to the species level, demonstrating a statistical
210 tendency (Figure 5A and Supplemental Table 4). At the phylum level, the relative abundance of Bacteroidota
211 increased significantly with increasing dietary CP levels (Figure 5B; *Coefficient* = 0.070, *FDR-P* = 0.0491).
212 Conversely, the Pseudomonadota and Bacillota to Bacteroidota ratios exhibited opposite associations (Figure 5B;
213 Pseudomonadota, *Coefficient* = -0.731 and *FDR-P* = 0.0361; Bacillota to Bacteroidota ratio, *Coefficient* = -0.320,
214 and *FDR-P* = 0.0275).

215 At the species level, three species within the class Gammaproteobacteria (*S. dextrinosolvens*, unclassified
216 species [US_] Gammaproteobacteria, and *Ruminobacter amylophilus*) and *Lentimicrobium saccharophilum*
217 exhibited a negative linear association with dietary CP levels (Figure 5B; *Coefficient* = -0.730, -0.801, -1.276, and -
218 0.821, and *FDR-P* = 0.0361, 0.0927, 0.0698, and 0.0768, respectively). In contrast, US_Bacteroidales, *Eubacterium*
219 *ventriosum*, and *Anaeroplasma abactoclasticum* showed positive linear associations (Figure 5B; *Coefficient* = 0.284,
220 0.947, and 1.269; *FDR-P* = 0.0361, 0.0698, and 0.0927, respectively).

221 222 Differences in predicted functional profiles

223 To compare the differences in overall bacterial function across different dietary CP levels, functional profiles
224 were predicted based on full-length 16S rRNA gene sequencing data using PICRUSt2. PCA based on the KEGG
225 ortholog levels showed a statistical tendency among the dietary treatments (Figure 6A, PERMANOVA, $P = 0.0712$),
226 revealing distinct clusters between the LCP and HCP treatments (Figure 6A, pairwise comparison, Pseudo- $F =$
227 4.0401 and $Q = 0.0236$). At the KEGG module level, 15 KEGG modules were differentially abundant among the
228 dietary treatments (Figure 6B, $P < 0.05$). Of the 15 differentially abundant KEGG modules, seven were related to
229 amino acid metabolism, three to carbohydrate metabolism, and five to energy metabolism. In the amino acid
230 metabolism, seven KEGG modules (M00015, Proline biosynthesis, glutamate to proline; M00025, Tyrosine
231 biosynthesis, chorismite to HPP to tyrosine; M00040, Tyrosine biosynthesis, chorismite to arogenate to tyrosine;
232 M00029, Urea cycle; M00034, Methionine salvage pathway; M00134, Polyamine biosynthesis, arginine to ornithine

233 to putrescine and M00948, Hydroxyproline degradation, trans-4-hydroxy-L-proline to 2-oxoglutarate) were
234 significantly enriched in the LCP group compared to the HCP group (Figure 6B). Among the three differentially
235 abundant KEGG modules related to carbohydrate metabolism, M00307 (Pyruvate oxidation, pyruvate to acetyl-
236 CoA) was significantly lower in the LCP group than in the other groups, whereas two modules (M00373,
237 Ethylmalonyl pathway, and M00741, Propanoyl-CoA to succinyl-CoA) exhibited significant differences between
238 the HMCP and HCP treatments (Figure 6B). In energy metabolism, two KEGG modules (M00149, Succinate
239 dehydrogenase and M00144, NADH:quinone oxidoreductase) were significantly enriched in the HCP group,
240 whereas M00374 (dicarboxylate-hydroxybutyrate cycle) was significantly lower in the LCP group than in the other
241 groups (Figure 6B). Additionally, two KEGG modules (M00150, Fumarate reductase, and M00595, Thiosulfate
242 oxidation by SOX complex, thiosulfate to sulfate) were enriched in the LCP group (Figure 6B).

243 MaAsLin2 analysis showed that 13 significant linear associations were identified between the KEGG modules
244 and increased dietary CP levels (Table 3). Among these, seven were associated with amino acid metabolism, two
245 with carbohydrate metabolism, and four with energy metabolism. Seven KEGG modules related to amino acid
246 metabolism (M00040, Tyrosine biosynthesis, chorismate to arogenate to tyrosine; M00136: GABA biosynthesis,
247 prokaryotes, putrescine to GABA; M00134, Polyamine biosynthesis, arginine to ornithine to putrescine; M00025,
248 Tyrosine biosynthesis, chorismate to HPP to tyrosine; M00034, Methionine salvage pathway; M00029, Urea cycle;
249 and M00021, Cysteine biosynthesis, serine to cysteine) showed a negative association with increasing dietary CP
250 levels. In contrast, two KEGG modules related to carbohydrate metabolism (M00307, Pyruvate oxidation, pyruvate
251 to acetyl-CoA; M00532, Photorespiration) were positively associated with increasing dietary CP levels. Among the
252 identified KEGG modules related to energy metabolism, M00150 (Fumarate reductase) was negatively associated
253 with increasing levels of dietary CP, whereas three KEGG modules (M00149, Succinate dehydrogenase; M00144,
254 NADH:quinone oxidoreductase, prokaryotes; and M00153, Cytochrome bd ubiquinol oxidase) were positively
255 associated.

256

257 *Correlation between the rumen microbiota and animal performance*

258 Correlation analysis using Spearman's correlation was conducted between animal performance metrics and 11
259 bacterial species that showed differential abundance or a linear relationship. Various strong relationships
260 (Coefficient $|\rho| > 0.4$ and $P < 0.10$) were identified (Figure 7). In terms of growth performance, US_Bacteroidales
261 were positively correlated with total and concentrated CP intake, whereas *S. dextrinosolvans* and *R. amylophilus*

262 were negatively correlated. Additionally, US_Bacteroidales and *Anaeroplasma abactoclasticum* were positively
263 correlated with ADG. Regarding rumen fermentation parameters, ammonia nitrogen (NH₃-N) was positively
264 correlated with US_Bacteroidales and *A. abactoclasticum*, but negatively correlated with *S. dextrinosolvens*, *L.*
265 *saccharophilum*, and *R. amylophilus*. In the volatile fatty acid (VFA) profiles, the propionate proportion was
266 negatively correlated with US_Bacteroidales and *Treponema bryantii* and positively correlated with *S.*
267 *dextrinosolvens*, whereas the acetate-to-propionate ratio showed the opposite correlation. The butyrate proportion
268 was negatively correlated with *S. dextrinosolvens*, US_Gammaproteobacteria, *L. saccharophilum*, and *R.*
269 *amylophilus*, and positively correlated with US_Bacteroidales. Among the blood metabolites, blood urea nitrogen
270 (BUN) was negatively correlated with *S. dextrinosolvens*, *L. saccharophilum*, and *R. amylophilus* and positively
271 correlated with US_Bacteroidales. Non-esterified fatty acids were negatively correlated with US_Bacteroidales and
272 *T. bryantii*, and positively correlated with *S. dextrinosolvens*. US_Bacteroidales, US_Christensenellaceae, and *A.*
273 *abactoclasticum* negatively correlated with one or more CH₄ concentrations, whereas *S. dextrinosolvens*,
274 US_Gammaproteobacteria, *L. saccharophilum*, and *R. amylophilus* were positively correlated.

275

276

Discussion

277 The growing emphasis on sustainable livestock production has prompted the exploration of various feed
278 ingredients capable of mitigating CH₄ emissions, which are a major GHG. DDGS, a byproduct of the bioethanol
279 industry, has garnered attention in this context because of its high CP and EE contents, leading to a potential dual
280 benefit: optimizing CP content while simultaneously reducing CH₄ emissions (11, 12). In a previous feeding trial
281 conducted by our colleagues, it was noted that increasing CP levels through DDGS supplementation resulted in
282 increased ADG levels and a concurrent decrease in CH₄ yield (ppm/kg of DMI) and CH₄ intensity (ppm/kg of ADG)
283 from eructation (19). Importantly, DMI was similar across treatments in the feeding trial, indicating that the
284 observed differences were primarily driven by dietary CP levels rather than feed intake variation. In the present
285 study, we identified bacterial taxa potentially associated with both ADG enhancement and CH₄ reduction, resulting
286 from increased CP levels modulated by DDGS supplementation.

287 In the present study, we observed that increasing the levels of CP through supplementation with up to 29.4%
288 DDGS in a concentrate mix did not result in alteration of the alpha diversity in the rumen microbiota of Hanwoo
289 steers during the early fattening period. This finding is consistent with several previous studies involving DDGS,
290 which also reported no significant differences in rumen microbiota richness and diversity across various ruminant

291 species, including beef cattle (31, 32), dairy cattle (33), and lambs (34, 35). In terms of beta diversity, our analysis
292 revealed a significant separation between the LCP and HCP groups when evaluated using a weighted UniFrac
293 distance matrix, whereas no significant differences were observed using the unweighted UniFrac distance matrix. In
294 contrast to our findings, previous studies reported no notable separation or differences when DDGS was included in
295 up to 50% of diets (33-35). A possible explanation for this discrepancy may be related to differences in dietary CP
296 levels. While previous studies increased DDGS inclusion while maintaining similar CP levels among treatments, the
297 present study increased CP levels by adjusting the proportion of DDGS in the diet. Therefore, the observed
298 differences in microbial community structure may be attributed to the combined effects of both CP level and DDGS
299 inclusion, and their individual contributions cannot be fully distinguished in this experimental design. The
300 divergence in findings between weighted and unweighted UniFrac distances is also noteworthy. Generally, weighted
301 UniFrac distance accounts for both the presence or absence and relative abundance of microbiota, whereas
302 unweighted UniFrac distance considers only the presence or absence of these microbial structures (36). This
303 observation suggests that the differences in the overall structure of rumen microbiota between the LCP and HCP
304 groups were predominantly driven by variations in the relative abundance of certain bacterial taxa. These findings
305 imply that bacterial populations with higher abundances play a significant role in differentiating rumen bacterial
306 communities. Biologically, this suggests that the varying CP levels primarily influence the relative abundance of
307 established taxa rather than altering the overall phylogenetic composition, reflecting changes in the activity of core
308 microbiota under different CP levels adjusted by DDGS supplementation.

309 Dietary shifts can affect rumen bacterial communities, which are influenced by their preference for various
310 nutrient sources, including different types of carbohydrates (structural carbohydrates vs. non-fiber carbohydrates
311 [NFC]), lipids (saturated fatty acids vs. unsaturated fatty acids), and CP (37-39). Despite dietary variations,
312 Bacteroidota and Bacillota remained the core phyla in the rumen and are dominant regardless of the diet type (40-
313 42). Consistent with previous findings, these phyla constituted at least 86% of the rumen samples in this study. An
314 increase in CP levels adjusted by DDGS significantly increased Bacteroidota levels and reduced the Bacillota to
315 Bacteroidota ratio. This aligns with previous studies reporting similar trends with varying levels of DDGS inclusion
316 (43, 44). However, there are inconsistencies in the responses of these phyla to different DDGS levels; some studies
317 observed no differences up to 25% DDGS inclusion (31, 32), whereas others reported opposite trends to our findings
318 at 20% inclusion (33). Castillo-Lopez et al. (35) suggested that varying DDGS levels might induce changes in
319 microbial composition by affecting diet composition, particularly crude fat and starch content. Interestingly, the

320 phylum Pseudomonadota and its members, including *S. dextrinosolvens*, *R. amylophilus*, and
321 US_Gammaproteobacteria, decreased linearly with increasing CP levels. Pseudomonadota is known for its role in
322 carbohydrate degradation in high-grain diets (45, 46), and its members, such as *S. dextrinosolvens* and *R.*
323 *amylophilus* are amylolytic and produce succinate via glucose metabolism (47, 48). Typically, succinate is rapidly
324 converted to propionate in the rumen (49, 50), as evidenced by a linear decrease in propionate levels in a previous
325 feeding trial (19). Despite the linear decreases in Succinivibrionaceae species and propionate, the CH₄ yield (ppm/kg
326 of DMI) and CH₄ intensity (ppm/kg of ADG) from eructation decreased linearly with higher CP levels adjusted by
327 DDGS (19). This suggests that CH₄ reduction is influenced by factors other than propionate production, which is an
328 alternative H₂ sink in the rumen. In the present study, US_Bacteroidales and *E. ventriosum* were enriched with
329 increasing CP levels, as adjusted by DDGS. Previous research has noted that various unclassified species belonging
330 to Bacteroidales may play a role in biohydrogenation (51). A positive correlation between conjugated linoleic acid in
331 serum and *E. ventriosum* suggests its involvement in this process (52). DDGS, which is rich in unsaturated fatty
332 acids, primarily linoleic acid (C18:2) and oleic acid (C18:1) (53), can mitigate CH₄ production through direct
333 toxicity against microbiota and biohydrogenation in the rumen environment (54-57). Biohydrogenation in the rumen
334 offers dual advantages; it acts as a detoxification mechanism and as an alternative H₂ sink for methanogenesis (54,
335 58). In this study, the EE content among treatments was maintained by supplementation with hydrogenated fat,
336 focusing on the differences in fatty acid composition, particularly between saturated and unsaturated fatty acids. The
337 high inclusion level of DDGS, leading to elevated unsaturated fatty acid levels, may have enriched
338 US_Bacteroidales and *E. ventriosum* and potentially inhibited methanogens, thereby reducing CH₄ yield. However,
339 as this study did not explore changes in methanogen populations, further research is needed to clarify the
340 interactions between methanogens and biohydrogenation-related rumen microbiota, specifically US_Bacteroidales
341 and *E. ventriosum* in CH₄ production.

342 The distinct bacterial community structures observed with increasing CP levels adjusted by DDGS led to
343 significant differences in the overall predicted functional features between the LCP and HCP groups. Typically,
344 ingested dietary proteins undergo digestion and fermentation into amino acids, peptides, and ammonia in the rumen,
345 primarily through proteolytic bacteria (59). Consequently, higher CP levels could directly influence the functional
346 attributes of rumen microbiota, affecting metabolic outcomes such as NH₃-N concentration in the rumen and BUN
347 concentration. A previous feeding trial confirmed this, showing a linear increase in NH₃-N concentration in the
348 rumen and BUN concentration with higher dietary CP levels adjusted by DDGS (19). The present bacterial

349 functional analysis predicted using PICRUST2 revealed significant shifts in KEGG modules related to amino acid
350 biosynthesis, including those for methionine (M00034), tyrosine (M00025 and M00040), proline (M00015), and
351 putrescine (M00134). Bacterial amino acid synthesis is an important microbial function that may contribute to
352 maintaining amino acid availability under conditions of limited dietary protein. Previous study in human gut has
353 suggested that gut microbiota can partially compensate for dietary protein deficiency through enhanced microbial
354 amino acid synthesis (60). In this context, the increased representation of amino acid biosynthesis pathways
355 observed in the LCP group may reflect a potential microbial adaptive response to lower CP availability. However,
356 this interpretation should be approached cautiously, as the functional predictions are based on PICRUST2 and the
357 mechanisms may differ in the rumen ecosystem. Additionally, M00150 (Fumarate reductase, prokaryotes) was more
358 prevalent in the LCP group than in the higher CP group, suggesting a decrease in fumarate-to-succinate metabolism
359 with increasing CP levels. This reduction might be related to the decreased proportion of propionate observed in an
360 earlier feeding trial. Moreover, the linear enrichment of M00307 (Pyruvate oxidation) and M00144 (NADH:quinone
361 oxidoreductase) was observed. The conversion of pyruvate to acetyl-CoA in the rumen involves enzymatic reactions
362 involving pyruvate formate lyase and pyruvate-ferredoxin oxidoreductase (61). In the pyruvate-ferredoxin
363 oxidoreductase pathway, included in M00307, pyruvate is converted into acetyl-CoA, CO₂, and reduced ferredoxin
364 (61). The reduced ferredoxin is reoxidized by ferredoxin—NAD⁺ oxidoreductase, which generates NADH (62).
365 NADH accumulation can inhibit microbial growth and fermentation under anaerobic conditions (63, 64). A previous
366 study linked the enzymatic reaction of NADH dehydrogenase and the reduction of unsaturated fatty acids to NADH
367 re-oxidation in butyrate production (65). Hence, the observed enrichment of biohydrogenation-related bacteria,
368 especially US_Bacteroidales and *E. ventriosum*, may be associated with the linear increase in ruminal butyrate
369 proportion in the preceding feeding trial.

370 Among the nine bacterial species that showed a significant correlation with at least one aspect of animal
371 performance, US_Bacteroidales exhibited notable positive correlations with CP intake, CP-related metabolites (such
372 as ruminal butyrate proportion and BUN), and ADG, all of which increased linearly with increasing CP levels
373 adjusted by DDGS in the preceding feeding trial. Members of the order Bacteroidales are commonly recognized as
374 carbohydrate degraders in anaerobic environments (66, 67). However, a recent metagenomic analysis has shown that
375 uncultured Bacteroidales populations possess the genetic capabilities for protein degradation, suggesting that they
376 are significant contributors as protein degraders (68, 69). Although there is no definitive evidence linking
377 US_Bacteroidales to increased ADG in ruminants, one possible explanation is its role in enhancing the utilization of

378 CP and lipids. Interestingly, both US_Gammaproteobacteria and *L. saccharophilum*, which decreased linearly with
379 increasing CP levels adjusted by DDGS, showed negative correlations with at least one CH₄ indicator.
380 Gammaproteobacteria encompass approximately 250 genera and are associated with pathogenicity and
381 methanotrophy (70, 71). Although Gammaproteobacteria methylotrophs have not been conclusively identified in the
382 rumen, they have been detected in other anaerobic environments (72, 73). Additionally, *L. saccharophilum*, initially
383 isolated from methanogenic granular sludge, can ferment glucose to acetate, formate, and hydrogen, suggesting its
384 potential involvement in hydrogenotrophic methanogenesis (74).

385 The findings of this study highlight the potential of DDGS-based dietary strategies to modulate rumen microbial
386 communities and associated metabolic functions. However, several limitations should be considered. The relatively
387 small sample size per group (n = 5-6) may limit the statistical power to detect subtle changes, particularly among
388 low-abundance taxa. In addition, this study relied on predicted functional profiles using PICRUSt2, which infers
389 gene content based on 16S rRNA data and may not fully capture the actual metabolic activity of the rumen
390 microbiome. Therefore, the functional interpretations should be considered with caution. Future studies integrating
391 metagenomic or metatranscriptomic approaches are needed to better elucidate the mechanisms underlying CH₄
392 mitigation and nutrient utilization associated with DDGS supplementation.

393

Conclusion

394
395 In summary, varying CP levels adjusted by DDGS influenced shifts in the rumen microbiota and their functional
396 implications in Hanwoo steers during the early fattening period. This study revealed that increasing dietary CP
397 levels by adjusting the DDGS induced a linear increase in US-Bacteroidales and *E. ventriosum*, which are related to
398 lipid metabolism in the rumen. These changes in bacterial community structure were accompanied by alterations in
399 predicted metabolic functions, including key KEGG modules related to amino acid, carbohydrate, and energy
400 metabolism. Importantly, our results demonstrate that dietary CP levels can modulate rumen microbial composition
401 and functional potential. The positive correlation between certain bacterial taxa, such as US_Bacteroidales, and
402 animal performance indicators, such as ADG and ruminal butyrate proportion, underscores the intricate relationship
403 between diet, microbiota, and animal productivity. Overall, this study provides insights into how dietary CP levels
404 adjusted by DDGS shape rumen microbial communities and their predicted functional profiles, contributing to a
405 better understanding of diet-microbiome interactions in ruminants.

Competing Interests

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407
408 No potential conflict of interest relevant to this article was reported.

Acknowledgments

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411 Not applicable.

Author's Contributions

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414 No potential conflict of interest relevant to this article was reported.

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Tables

618 **Table 1.** Analyzed chemical composition (g/kg DM or as stated) of experimental diets

| Item ¹ | Treatment ² | | | | Tall fescue |
|----------------------------|------------------------|------|------|-----|-------------|
| | LCP | LMCP | HMCP | HCP | |
| Chemical composition | | | | | |
| DM, g/kg as fed | 886 | 886 | 886 | 886 | 888 |
| OM | 911 | 916 | 918 | 920 | 941 |
| CP | 147 | 178 | 193 | 208 | 69 |
| NDICP | 26 | 27 | 27 | 27 | 13 |
| ADICP | 12 | 13 | 14 | 15 | 9 |
| aNDF | 271 | 286 | 293 | 301 | 640 |
| ADF | 134 | 131 | 129 | 128 | 404 |
| ADL | 38 | 37 | 36 | 36 | 62 |
| EE | 69 | 62 | 59 | 56 | 13 |
| Ash | 89 | 84 | 82 | 80 | 59 |
| Ca | 15 | 13 | 12 | 10 | 3 |
| P | 6 | 6 | 7 | 7 | 1 |
| NFC | 450 | 417 | 400 | 383 | 232 |
| TDN | 747 | 740 | 736 | 733 | 557 |
| NE _m , MJ/kg DM | 8.1 | 8 | 7.9 | 7.8 | 5 |
| NE _g , MJ/kg DM | 5.4 | 5.3 | 5.2 | 5.2 | 2.7 |

619 ¹DM, dry matter; OM, organic matter; CP, crude protein; NDICP, neutral detergent fiber insoluble CP; ADICP, acid
 620 detergent insoluble CP; aNDF, neutral detergent fiber analyzed using a heat-stable amylase and expressed inclusive
 621 of residual ash; ADF, acid detergent fiber; ADL, acid detergent lignin; EE, ether extract; NFC, non-fiber
 622 carbohydrate; TDN, total digestible nutrients; NE_m, net energy for maintenance; NE_g, net energy for growth.

623 ²LCP, concentrate mix consisting of low crude protein (CP); LMCP, concentrate mix consisting of lower-middle
 624 CP; HMCP, concentrate mix consisting of higher-middle CP; HCP, concentrate mix consisting of high CP.
 625

626 **Table 2.** Linear association between alpha diversity measurements and dietary crude protein levels¹

| Items | Coefficient | Standard error | FDR- P^2 |
|--------------------------------|-------------|----------------|------------|
| Chao1 | -0.038 | 0.022 | |
| Observed ASVs | -0.015 | 0.016 | 0.336 |
| Faith's phylogenetic diversity | 0.093 | 0.045 | 0.444 |
| Evenness | 0.132 | 0.108 | 0.336 |
| Shannon index | 0.103 | 0.085 | 0.398 |
| Simpson index | 0.124 | 0.113 | 0.398 |

627 ASV, amplicon sequence variant.

628 ¹ Linear associations were evaluated using Microbiome multivariable association with linear models (MaAsLin2).

629 ² Statistical P values from MaAsLin2 were adjusted using Benjamini–Hochberg adjustment (FDR- P).

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631 **Table 3.** Significant linear associations between KEGG modules and dietary crude protein levels¹

| KEGG modules | KEGG BRITE ² level 2 | Coefficient | Standard error | FDR- <i>P</i> ² | Description |
|--------------|---------------------------------|-------------|----------------|----------------------------|---|
| M00025 | AA metabolism | -1.596 | 0.5020 | 0.0433 | Tyrosine biosynthesis, chorismate to aroenate to tyrosine |
| M00040 | AA metabolism | -1.176 | 0.2899 | 0.0196 | GABA biosynthesis, prokaryotes, putrescine to GABA |
| M00021 | AA metabolism | -0.527 | 0.1185 | 0.0122 | Polyamine biosynthesis, arginine to ornithine to putrescine |
| M00034 | AA metabolism | -0.065 | 0.0192 | 0.0310 | Tyrosine biosynthesis, chorismate to HPP to tyrosine |
| M00136 | AA metabolism | -0.051 | 0.0108 | 0.0094 | Methionine salvage pathway |
| M00134 | AA metabolism | -0.034 | 0.0094 | 0.0236 | Urea cycle |
| M00029 | AA metabolism | -0.024 | 0.0072 | 0.0310 | Cysteine biosynthesis, serine to cysteine |
| M00307 | CA metabolism | 0.039 | 0.0101 | 0.0218 | Pyruvate oxidation, pyruvate to acetyl-CoA |
| M00532 | CA metabolism | 0.031 | 0.0082 | 0.0218 | Photorespiration |
| M00150 | EN metabolism | -0.609 | 0.1450 | 0.0179 | Fumarate reductase, prokaryotes |
| M00149 | EN metabolism | 0.067 | 0.0203 | 0.0350 | Succinate dehydrogenase, prokaryotes |
| M00144 | EN metabolism | 0.066 | 0.0179 | 0.0236 | NADH:quinone oxidoreductase, prokaryotes |
| M00153 | EN metabolism | 0.052 | 0.0156 | 0.0343 | Cytochrome bd ubiquinol oxidase |

632 ¹ Linear associations were evaluated using Microbiome multivariable association with linear models (MaAsLin2).

633 ² Only Kyoto encyclopedia of Genes and Genomes (KEGG) modules for amino acid metabolism (AA),
 634 carbohydrate metabolism (CA), and energy metabolism (EN) are presented.

635 ² Statistical *P* values from MaAsLin2 were adjusted using Benjamini–Hochberg adjustment (FDR-*P*).

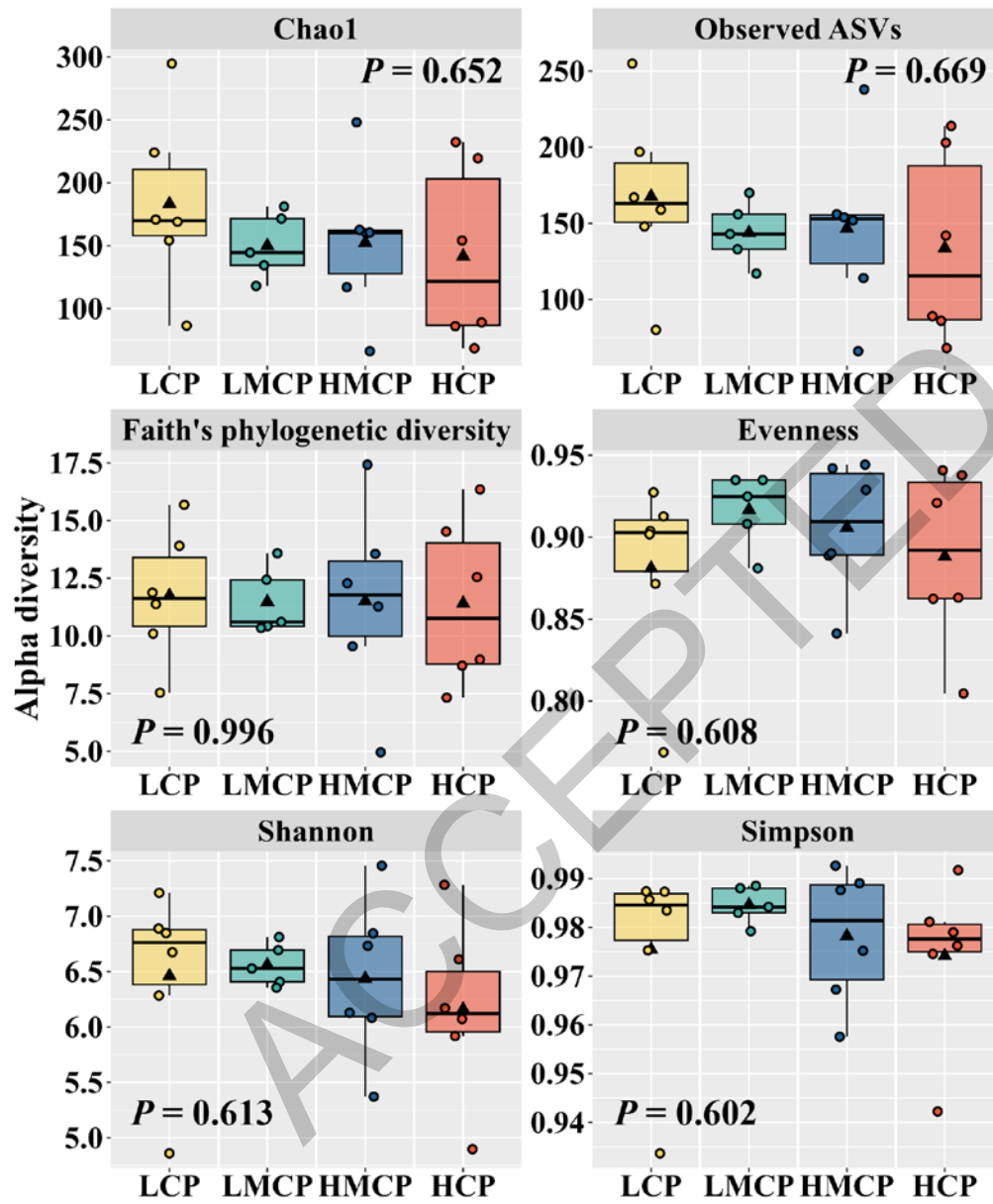
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Figure legends

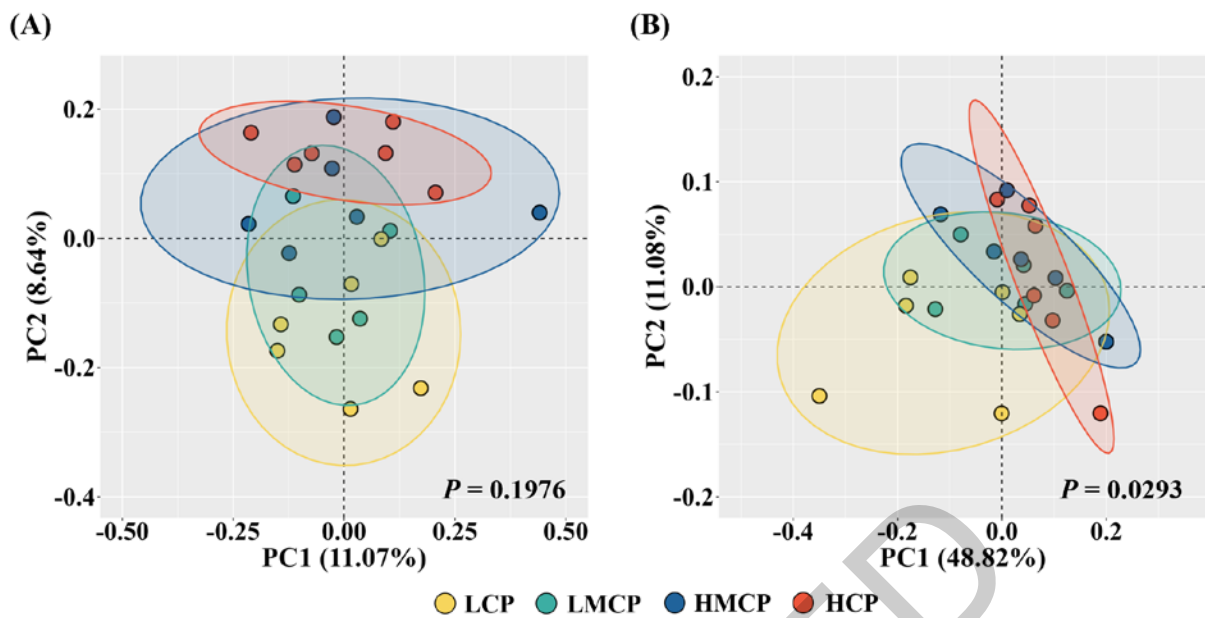
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641 **Figure 1.** Differences in alpha diversity measurements of the rumen microbiota.

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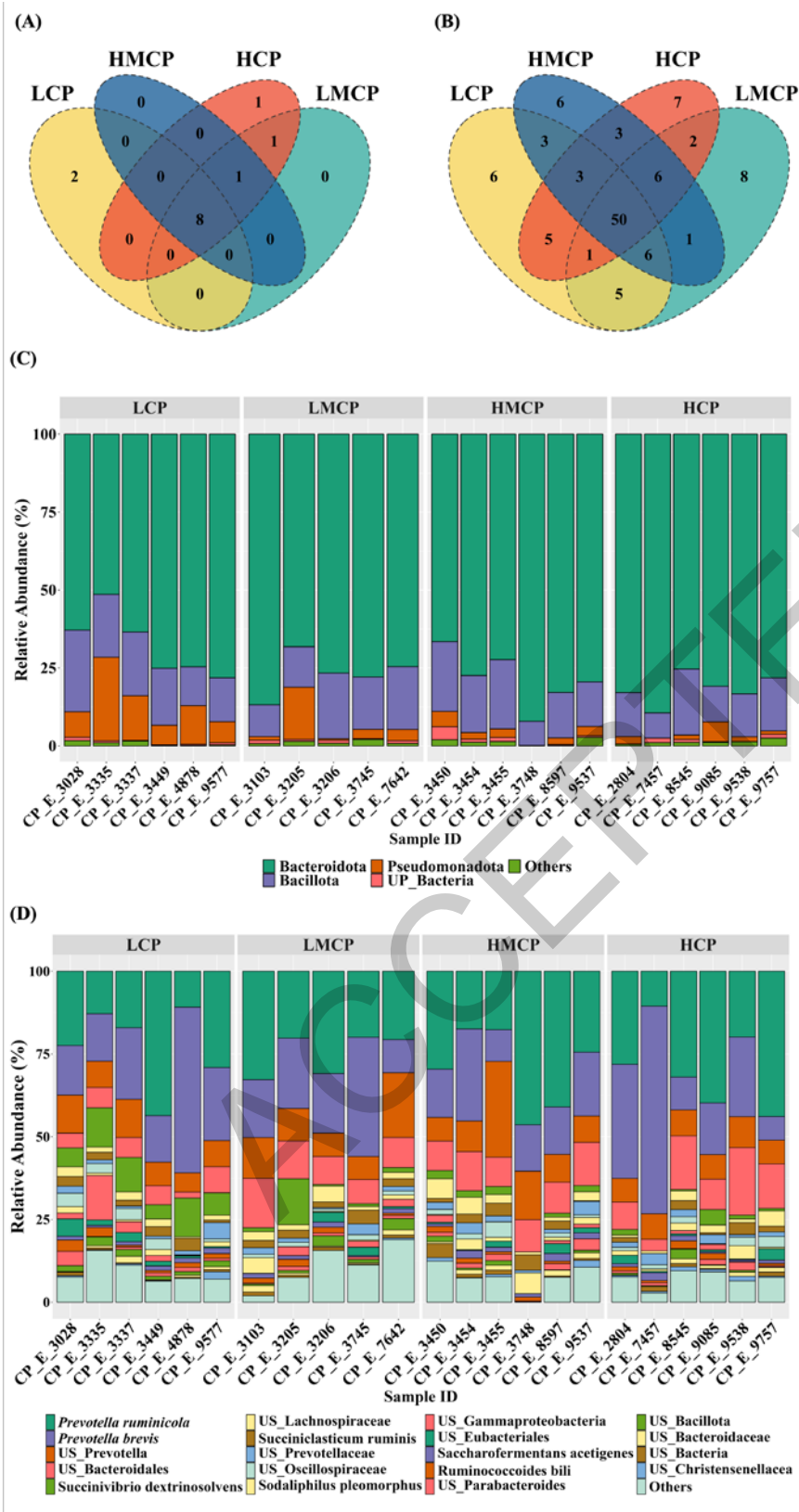


| Pairwise comparison | | Pseudo- <i>F</i> | <i>Q</i> -value | Pairwise comparison | | Pseudo- <i>F</i> | <i>Q</i> -value |
|---------------------|------|------------------|-----------------|---------------------|------|------------------|-----------------|
| LCP | LMCP | 1.6870 | 0.3138 | LCP | LMCP | 1.0093 | 0.6699 |
| LCP | HMCP | 2.7979 | 0.1302 | LCP | HMCP | 1.2146 | 0.2904 |
| LCP | HCP | 4.1376 | 0.0276 | LCP | HCP | 1.4974 | 0.0132 |
| LMCP | HMCP | 0.6832 | 0.8267 | LMCP | HMCP | 0.8823 | 0.9594 |
| LMCP | HCP | 1.2721 | 0.3138 | LMCP | HCP | 1.1449 | 0.2904 |
| HMCP | HCP | 0.5277 | 0.8662 | HMCP | HCP | 0.7379 | 0.9594 |

643

644 **Figure 2.** Principal coordinate analysis based on (A) unweighted and (B) weighted UniFrac distance matrices of
 645 rumen microbiota. Permutational multivariate analysis of variance was used to compare differences in the rumen
 646 microbiota.

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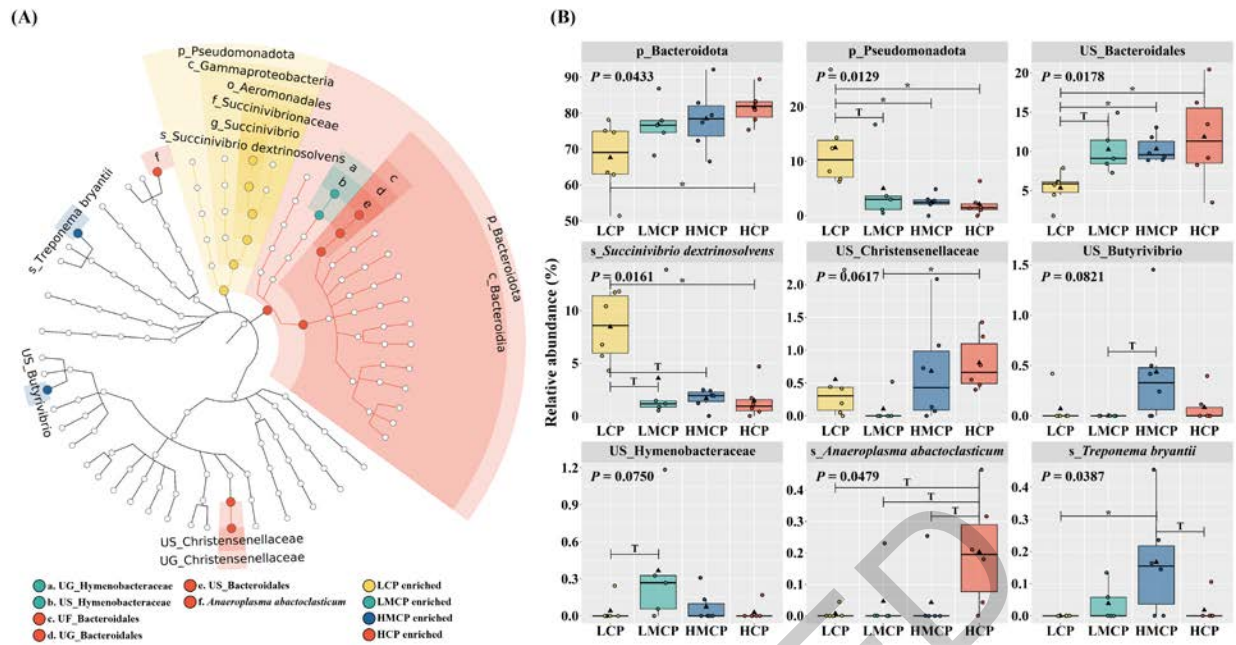
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Figure 3. Distribution of rumen microbiota according to dietary CP adjusted using DDGS. (A-B) Venn diagram depicting the shared and unique microbiota at the (A) phylum and (B) species levels in the rumen microbiome. (C-

651 D) Taxa bar plot of the predominant rumen microbiota at the (C) phylum and (D) species levels. Only taxa having \geq
652 30% of occurrence and 0.5% of relative abundance are visualized.
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655 **Figure 4.** Differentially abundant rumen microbiota depending on dietary crude protein levels. (A) Cladogram

656 describing the overall differences in rumen microbiota. (B) Differentially abundant phyla and species. Differentially

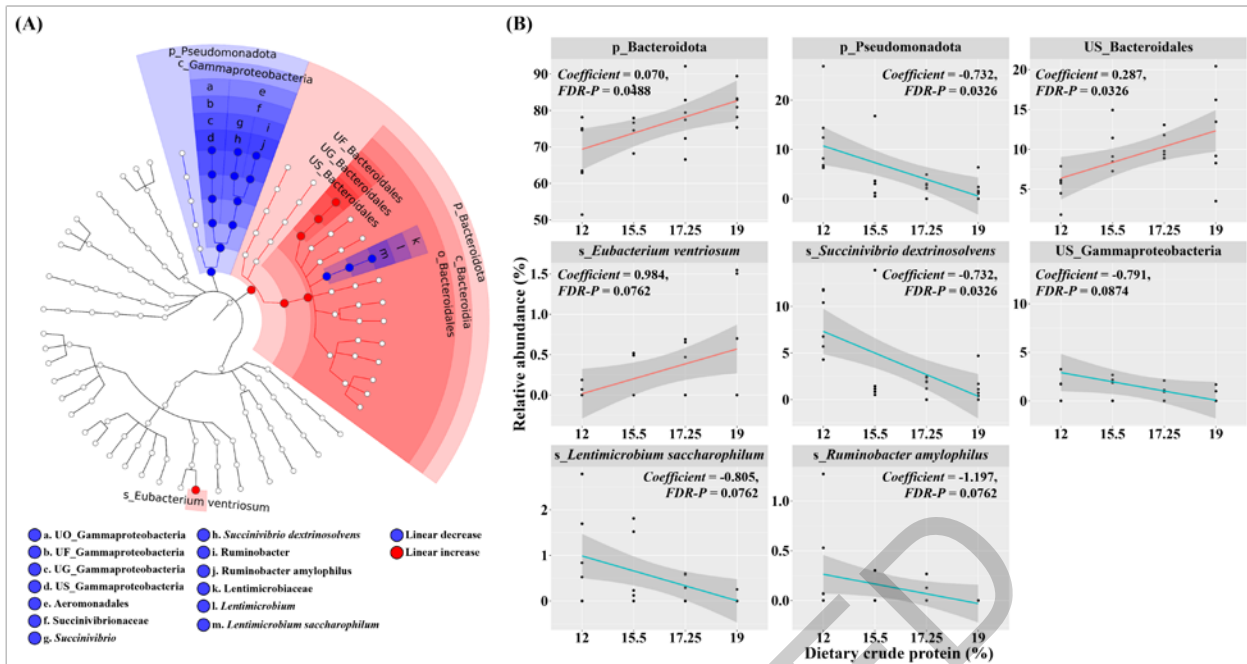
657 abundant microbiota were identified based on the Kruskal–Wallis test, followed by Dunn’s post hoc test with

658 Benjamini–Hochberg adjustment; only microbial taxa detected in at least 30% of occurrences among the treatments

659 were evaluated. p_, phylum; c_, class; o_, order; f_, family; g_, genus; s_, species; US_, unclassified species; T,

660 $0.05 \leq P \leq 0.10$; *, $P < 0.05$; **, $P < 0.01$; ***, $P < 0.001$.

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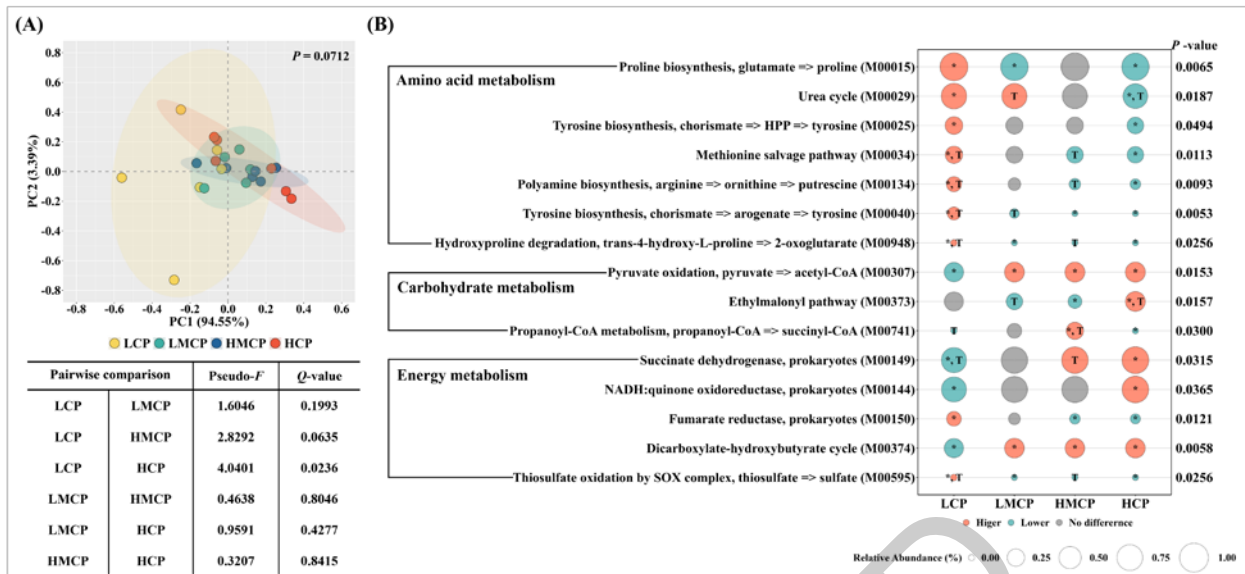
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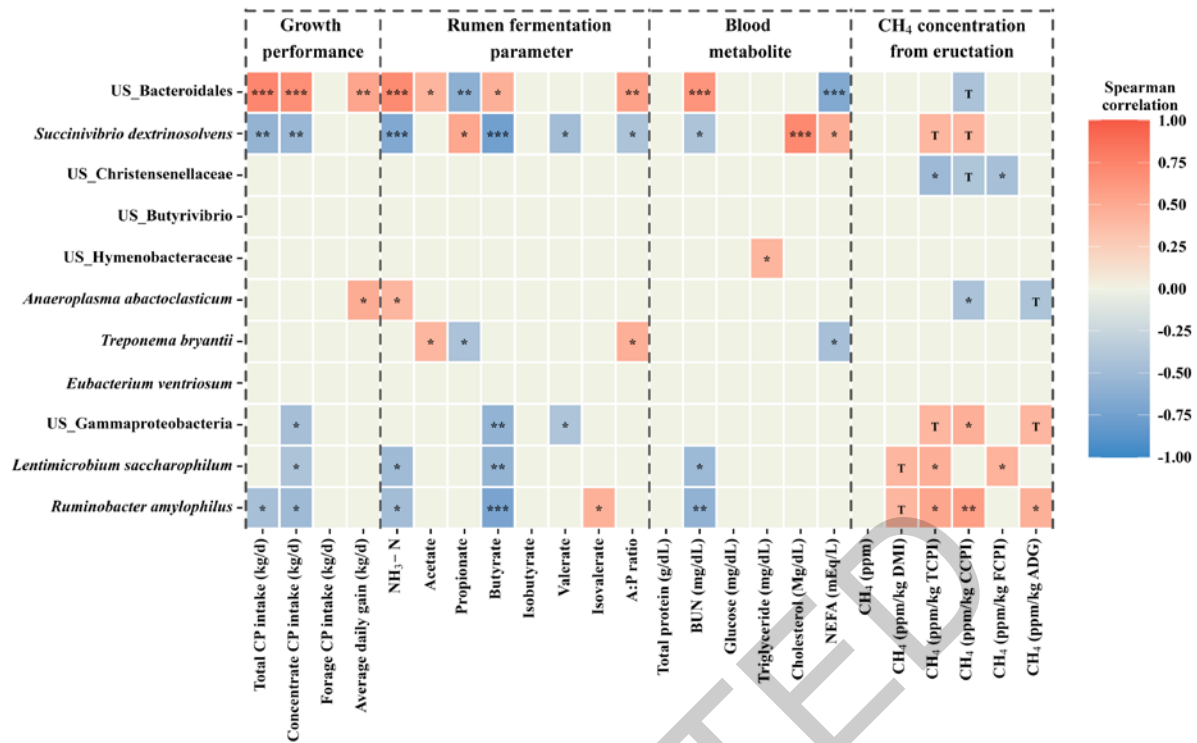
Figure 5. Linear association between the ruminal microbiota and dietary crude protein levels. (A) Cladogram showing a linear association between microbial taxa and crude protein levels. (B) Linear associations at phylum and species levels. Only microbial taxa detected in $\geq 30\%$ of the occurrences among the treatments were evaluated. Linear associations were evaluated using Microbiome multivariable association with linear models (MaAsLin2). Statistical P values from MaAsLin2 were adjusted using Benjamini–Hochberg adjustment ($FDR-P$).



669

670 **Figure 6.** Overall changes in the predicted functional profiles according to dietary crude protein levels. Predicted
 671 functional profiles were determined using the Phylogenetic Investigation of Communities by Reconstruction of
 672 Unobserved States 2 (version 2.5.0) and matched based on the Kyoto Encyclopedia of Genes and Genomes (KEGG)
 673 database. (A) Principal component analysis plot based on KEGG orthologs. (B) Differentially enriched KEGG
 674 modules. Only significant KEGG modules belonging to amino acid, carbohydrate, and energy metabolism at KEGG
 675 Brite level 2 were visualized.

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Figure 7. Correlation analysis of rumen microbiota and animal characteristics. Spearman's correlation coefficient between rumen microbiota and animal characteristics was calculated, and correlations above $|r| = 0.4$ and $P < 0.10$ were visualized. Only rumen microbiota detected in at least one statistical tendency on the Kruskal–Wallis test or microbiome multivariable association with linear models analysis (MaAsLin2) were evaluated. The degree of each correlation is indicated by the intensity of the color based on the color key on the right-hand side. US_, unclassified species; T, $0.05 \leq P \leq 0.10$; *, $P < 0.05$; **, $P < 0.01$; ***, $P < 0.001$.