# The metabolic influence of the core ciliate *Entodinium caudatum* within the rumen microbiome

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# 19 ABSTRACT

20 Protozoa comprise a major fraction of the microbial biomass in the rumen microbiome, of which the 21 genus Entodinium has been consistently observed to be dominant across a diverse genetic and 22 geographical range of ruminant hosts. Despite the apparent core role that species such as *Entodinium* 23 caudatum exert, their major biological and metabolic contributions to rumen function remain largely 24 undescribed. Here, we have leveraged (meta)genome-centric metaproteomes from rumen fluid 25 samples originating from both cattle and goats fed diets with varying inclusion levels of lipids and 26 starch, to detail the specific metabolic niches that *E. caudatum* occupies in the context of its microbial 27 co-habitants. Initial proteome estimations via total protein counts and label-free quantification 28 highlight that *E. caudatum* comprises an extensive fraction of the total rumen metaproteome. Our analysis also suggested increased microbial predation and volatile fatty acid (VFA) metabolism by E. 29 30 caudatum to occur in high methane-emitting animals, although with no apparent direct metabolic link to methanogenesis. Despite E. caudatum having a well-established reputation for digesting starch, it 31 32 was unexpectedly less detectable in low methane emitting-animals fed high starch diets, which were 33 instead dominated by propionate/succinate-producing bacterial populations suspected of being 34 resistant to predation irrespective of host. Finally, we reaffirmed our abovementioned observations 35 in geographically independent datasets, thus illuminating the substantial metabolic influence that

36 under-explored eukaryotic populations have in the rumen, with greater implications for both digestion

37 and methane metabolism.

38 Keywords: Protozoa, *Entodinium caudatum*, metaproteomics, metagenomics, multi-omics, methane,
 39 rumen

#### 40 BACKGROUND

41 Ruminants operate in symbiosis with their intrinsic rumen microbiome, which is responsible for the degradation of forage into nutrients, in the form of volatile fatty acids (VFAs), supplying ~70% of net 42 43 energy for the host<sup>1</sup>. The rumen microbiome itself is a complex assemblage of bacterial, fungal, 44 archaeal, viral, and protozoal microorganisms whose intricate composition and function is connected 45 to host productivity traits, such as feed efficiency, milk yield, animal health and greenhouse gas (GHG) emissions<sup>2-5</sup>. Large collaborative research efforts have been made to identify and characterize the core 46 rumen microbiome including creating a publicly available catalogue for cultivated and sequenced 47 genomes<sup>6-8</sup>. In the rumen, bacteria is estimated to constitute 50-90 %, protozoa 10-50 %, fungi 5-10% 48 and archaea less than 4% of the total microbial biomass<sup>9,10</sup>. Due to the difficulties of axenically 49 50 culturing rumen eukaryotic populations and their complex genomic features that are obstinate to 51 current metagenomic technologies, the reconstruction of the rumen microbiome has been heavily 52 biased towards bacterial and archaeal members, whereas the fungal and protozoal contributions of the rumen currently remain poorly characterized. While anaerobic fungi have a reputable role as fibre 53 54 degraders in the rumen, only 18 anaerobic gut fungi from herbivores are currently described, with only 11 genomes available<sup>11-13</sup>. Similarly, to date few rumen protozoal genomes are sequenced and 55 56 publicly available, chief among them, the rumen ciliate protozoa Entodinium caudatum<sup>14</sup>.

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Entodinium represents one of the most dominant genera of rumen protozoa, previously being 58 59 detected in more than 99% of 592 rumen samples at a mean protozoal relative abundance of ~38% 60 (2015 rumen census: 32 animal species, 35 countries)<sup>15</sup>. While *E. caudatum* has been previously observed to stimulate methane production<sup>16</sup>, it is believed that this protozoa lacks hydrogenosomes, 61 62 and instead encodes mitosomes and iron hydrogenases that may indicate hydrogen production, beneficial for methanogenic endosymbionts<sup>17</sup>. Here, we present a genome-centric metaproteomics 63 64 analysis of the rumen microbiome from two different host species Holstein dairy cows (Bos taurus) 65 and alpine goats (Capra hircus) that were fed diets of first-cut grassland hay with a 45:55 forage:concentrate ratio, with concentrates supplemented with either no additional lipid (CTL), or 66 corn oil and cracked-wheat starch grains (COS) <sup>5,18,19</sup>. Moreover, metadata revealed that animals fed 67 COS displayed reduced methane emissions, irrespective of host. To describe how these diets affect 68 69 digestion and production of methane and VFA's, we sought to investigate changes in function and 70 composition in the complex rumen microbiome. By using shotgun metagenomic sequencing we 71 recovered in total 244 prokaryote metagenome-assembled genomes (MAGs) that together with selected isolate-derived eukaryote genomes<sup>14,20-25</sup> formed the database for our integrated functional 72 73 analysis of *E. caudatum*. Despite *E. caudatum* having the genetic ability to degrade plant 74 polysaccharides such as starch and produce hydrogen, our analysis showed contrasting data that 75 suggests E. caudatum is less metabolically active in the rumen microbiome of animals fed a starch-76 rich diet. In such a scenario other starch-degrading and/or propionate and succinate producing 77 bacterial genera, as Prevotella and Fibrobacter and members of the families Succinivibrionaceae and 78 Aminobacteriaceae appeared to be more prevalent. In concert, our analysis showed that reduced 79 methane production in both cattle and goats eating feeds supplemented with COS is likely caused via 80 a redirection of hydrogen to succinate and propionate production instead of methanogenesis. Finally, 81 by analysing a secondary, geographically independent dataset, we reaffirmed our primary 82 observations of E. caudatum dominance and starch-related metabolism, thus supporting our 83 hypothesis that this protozoal species plays a core role in rumen microbiome function.

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#### 85 **METHODS**

# 86 Animal trial and sample handling

87 The experimental procedures were approved by the Auvergne-Rhône-Alpes Ethics Committee for 88 Experiments on Animals (France; DGRI agreement APAFIS#3277-2015121411432527 v5) and 89 complied with the European Union Directive 2010/63/EU guidelines. Experiments were performed at 90 the animal experimental facilities of HerbiPôle site de Theix at the Institut National de la Recherche 91 pour l'Agriculture, l'Alimentation l'Environnement (INRAE, Saint-Genès-Champanelle, France) from 92 February to July 2016. Experimental design, animals and diets were previously described by Fougère 93 et al.<sup>19</sup> and Martin et al.<sup>5</sup>. Briefly, 4 Holstein cows and 4 Alpine goats, all lactating, were enrolled in respectively two 4 x 4 Latin square design trials to study the effects of 4 diets over four 28-d 94 95 experimental periods. The original study included a control diet and 3 experimental diets with various lipid sources<sup>19</sup>. However, in this work, we only focused on the CTL (grass hay and concentrates 96 97 containing no addition lipids) and COS (CTL diet supplemented with corn oil and wheat starch) diets 98 which were associated with the most extreme methane (CH<sub>4</sub>) emission profiles in both ruminant 99 species. In the present study, we focused on the two following diets: a diet composed of grass hay ad 100 libitum with concentrates containing no additional lipid (CTL) or corn oil (5.0% total dry matter intake (DMI)) and cracked-wheat starch -5.0 % of total DMI (COS) (Table 1). Corn oil (Olvea, Saint Léonard, 101 102 France) was added to the concentrate, at 5% of total DMI and contained (g/kg of total FA): 16:0 (114), 103 18:0 (16.4), cis-9 18:1 (297), cis-11 18:1 (6.30), 18:2n-6 (535), 18:3n-3 (7.57), 20:0 (3.48), 22:0 (1.0),

24:0 (1.5), and total FA (1000 g/kg). Detailed diet composition is available in Martin *et al.*<sup>5</sup>. Each
experimental period lasted for 28 days. Diets were offered as 2 equal meals at 0830 and 1600h.
Animals had access to a constant supply of freshwater ad libitum. Concentrate and hay refusals were

107 weighed daily. The amounts of feed offered the following day was adjusted regarding to refusals to

108 maintain the targeted the dietary 45 % dry matter (DM) forage and 55 % DM concentrate ratio.

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110 Table 1. Summary of the animal host, dietary conditions and accompanying metadata that are linked to the 111 rumen samples used to explore *E. caudatum* function. Effects of control diet (CTL) and diet supplemented with 112 corn oil and wheat starch (COS) on average VFA concentration in the percentage of total VFA concentration 113 (mmol/l) and average methane yield (CH<sub>4</sub> g/kg DMI) in addition to average total protozoa cell counts and average 114 cell counts for small Entodiniomorph protozoa for cows (n=4) and goats (n=4) (Supplementary Table S1)<sup>5</sup>. Total 115 protozoal cell counts, and cell counts of small Entodiniomorph protozoa were based on ciliate protozoa 116 morphology in microscopy<sup>5</sup>. Measurements on VFA concentrations and methane yield were determined by gas 117 chromatography and respiration chambers, respectively.

Animal	Diet	VFA sum			Butyrate	CH₄ g/kg dry			Small entodiniomorphs
		mmol/l	(% sum)	(% sum)	(% sum)	matter intake	deviation	(10 <sup>°</sup> cells/ml)	(<100µm) (10 <sup>3</sup> cells/ml)
cow	CTL	61.83	72.02	14.21	10.80	19.51	2.18	92	51
	COS	68.06	69.12	21.32	6.39	14.45	2.89	100	97
GOAT	CTL	33.70	65.73	15.62	13.66	19.52	3.96	1382	1346
	COS	25.27	64.17	19.07	9.90	13.47	4.14	898	898

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119 Rumen fluid was collected through stomach-tubing before the morning feeding on day 27 of each experimental period. The stomach tube consisted of a flexible 23 mm external diameter PVC hose 120 121 fitted to a 10 cm-strainer at the head of the probe for cows, and a flexible 15 mm PVC hose with a 12 122 cm-strainer for goats. The first 200 ml of rumen fluid was discarded from to minimize contamination 123 from saliva. Samples were filtered through a polyester monofilament fabric (280 µm pore size), 124 dispatched in 2-ml screw-cap tubes, centrifuged at 15000 x g for 10 mins and the pellet snap-frozen in liquid nitrogen. Samples were stored at -80°C until DNA extraction using the Yu and Morrison bead-125 beating procedure <sup>26</sup>. In total, 32 rumen fluid samples (4 cattle and 4 goats fed four diets included in 126 the original study<sup>19</sup>) were sent to the Norwegian University of Life Sciences (NMBU) for metagenomic 127 128 and metaproteomic analysis. Respiration chambers were used to measure methane emissions over a 129 5-day period, while VFA and NH<sub>3</sub> concentrations were determined by gas chromatography using a flame ionization detector<sup>27</sup>. Protozoa were counted by microscopy and categorized as either small 130 131 entodiniomorphs (<100  $\mu$ m), large entodiniomorphs (>100  $\mu$ m) or as holotrichs Dasytricha and 132 *Isotricha*<sup>9</sup>. Further specifics about diets and measurements can be found in Martin *et al.*<sup>5</sup> and VFA and 133 methane measurements are summarized in Table 1. 134

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#### 137 Metagenomic sequencing and analysis

138 Metagenomic shotgun sequencing was performed at the Norwegian Sequencing Centre on two lanes 139 of the Illumina HiSeq 3/4000 generating 150 bp paired-end reads in both lanes. Sequencing libraries 140 were prepared using the TruSeq DNA PCR-Free High Throughput Library Prep Kit (Illumina, Inc) prior to sequencing. All 32 samples (4 cattle and 4 goats fed four diets included in the original study<sup>19</sup>) were 141 142 run on both lanes to prevent potential lane-to-lane sequencing bias. FASTQ files were quality filtered and Illumina adapters removed using Trimmomatic <sup>28</sup> (v. 0.36) with parameters -phred33 for base 143 quality encoding, leading and trailing base threshold set to 20. Sequences with an average quality 144 145 score below 15 in a 4-base sliding window were trimmed and the minimum length of reads was set to 36 bp. MEGAHIT <sup>29</sup> (v.1.2.9) was used to co-assemble reads originating from samples collected from 146 cow and goats separately, with options -kmin-1pass, --k-list 27,37,47,57,67,77,87, --min-contig-len 147 148 1000 in accordance with <sup>7</sup>. Bowtie2<sup>30</sup> (v. 2.3.4.1) was used to map reads back to the assemblies and SAMtools<sup>31</sup> (v. 1.3.1) was used to convert SAM files to BAM format and index sorted BAM files. 149

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The two co-assemblies (one from the samples originating from cattle and the other originating from 151 the samples of goats) were binned using Maxbin2<sup>32</sup>, MetaBAT2<sup>33</sup> and CONCOCT<sup>34</sup>. MetaBAT2 (v. 152 153 2.12.1) was run using parameters -minContig 2000 and -numThreads 4, Maxbin2 (v. 2.2.7) ran with default parameters and -thread 4, min contig length 2000, and CONCOCT (v. 1.1.0) ran with default 154 parameters and -length\_threshold 2000. Further, bins were filtered, dereplicated and aggregated 155 using DASTool<sup>35</sup>(v. 1.1.2) with the parameters – write bins 1, --threads 2 and BLAST<sup>36</sup> as search engine. 156 This resulted in a total of 244 dereplicated MAGs across the two host species (104 originating from 157 cow and 140 from goat). CheckM<sup>39</sup>(v. 1.1.3) lineage workflow was used to determine completeness 158 159 and contamination of each MAG, with parameters --threads 8, --extension fa, and CoverM (v. 0.5.0) (https://github.com/wwood/CoverM) was used to calculate relative abundance of each MAG, while 160 161 GTDB-tk<sup>40,41</sup> (v. 1.3.0) was used for taxonomic annotation. 90% (219 of 244) of the recovered MAGs were considered high or medium quality MAGs according to MIMAGs threshold for completeness and 162 contamination for genome reporting standards<sup>42</sup>. Gene calling and functional annotation of the final 163 MAGs were performed using the DRAM<sup>43</sup> pipeline with the databases dbCAN<sup>44</sup>, Pfam<sup>45</sup>, Uniref90<sup>46</sup>, 164 Merops<sup>47</sup>, VOGdb and KOfam<sup>48</sup>. The translated amino acid sequences from the publicly available 165 drafted *E. caudatum* macronucleus genome were annotated with the KEGG metabolic pathway 166 database using BlastKOALA<sup>49</sup> by Park *et al.*<sup>14</sup>. Proteins with resulting KEGG Orthology (KO) numbers 167 were functionally assigned to metabolic pathways using KEGG Mapper Reconstruct Tool <sup>50</sup>. 168

170 The resulting protein sequences for each MAG, as well as those from the host genomes of goat (Capra 171 hircus, NCBI ID: 10731) and cattle (Bos taurus, NCBI ID: 82) were compiled into two databases, from 172 now on referred to as sample specific RUmen DataBase for Goat (RUDB-G) and sample specific RUmen DataBase for cattle (RUDB-C). In addition, the genomes of the protozoa *Entodinium caudatum*<sup>14</sup> and 173 Fibrobacter succinogenes S85 (NCBI ID: 932) was added to both rumen databases. F. succinogenes is 174 175 well recognized as a primary cellulolytic bacterium in the rumen microbiome and has previously been 176 observed as an active microorganism in similar studies yet was not thoroughly binned as a unique 177 MAG in this study. Nine available fungal genomes downloaded from Joint Genome Institute (JGI) 178 Mycocosm<sup>51</sup> were added to RUDB-C (Anaeromyces sp. S4<sup>21</sup>, Caecomyces churrovis<sup>24</sup>, Neocallimastix californiae<sup>21</sup>, Neocallimastix lanati<sup>25</sup>, Piromyces finnis<sup>21</sup>, Piromyces sp. E2<sup>21</sup>, Piromyces UH3-1<sup>20,21,23</sup>, 179 *Piromyces* eukMAG<sup>52</sup>, *Orpinomyces* sp.<sup>22</sup>). Because of database size restrictions in downstream 180 181 analysis of metaproteomics data<sup>53</sup>, only four of the nine fungal genomes were added to RUDB-G 182 (Anaeromyces sp. S4, Caecomyces churrovis, Neocallimastix lanati, Piromyces UH3-1). In total the 183 complete databases consisted of 452 073 and 431 023 protein entries for RUDB-G and RUDB-C, 184 respectively.

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### 186 Metaproteomic data generation

To 300 µL of rumen fluid sample (in total 32 rumen fluid samples originating 4 cattle and 4 goats fed 187 four diets included in the original study<sup>19</sup>) 150 µL lysis buffer (30 mM DTT, 150 mM Tris-HCl (pH=8), 188 189 0.3% Triton X-100, 12% SDS) was added together with 4 mm glass beads ( $\leq$  160  $\mu$ m), followed by brief 190 vortexing and resting on ice for 30 mins. Lysis was performed using FastPrep-24™ Classic Grinder (MP Biomedical, Ohio, USA) for 3 × 60 seconds at 4.0 meter/ second<sup>54</sup>. Samples were centrifuged at 16 000 191 192  $\times q$  for 15 minutes at 4°C and lysate was carefully removed. Protein concentration was measured using the Bio-Rad DC<sup>™</sup> Protein Assay (Bio-Rad, California USA) with bovine serum albumin as standard. 193 194 Absorbance of sample lysates was measured at A750 on BioTek<sup>™</sup> Synergy<sup>™</sup> H4 Hybrid Microplate 195 Reader (Thermo Fisher Scientific Inc., Massaschusetts, USA). 40-50 µg of protein was prepared in SDS-196 buffer, heated in water bath for 5 minutes at 99°C and analysed by SDS-PAGE using Any-kD Mini-197 PROTEAN TGX Stain-Free<sup>™</sup> gels (Bio-Rad, California, USA) in a 2-minute run for sample clean-up purposes, before staining with Coomassie Blue R-250. The visible bands were carefully excised from 198 199 the gel and divided as 1×1 mm pieces before reduction, alkylation, and digestion with trypsin. Peptides 200 were concentrated and eluted using C18 ZipTips (Merck Millipore, Darmstadt, Germany) according to manufacturer's instructions, dried, and analysed by nano-LC-MS/MS using a Q-Exactive hybrid 201 202 quadrapole Orbitrap MS (Thermo Fisher Scientific Inc., Massaschusetts, USA) as previously described<sup>55</sup>

#### 204 Metaproteomic data analysis

Acquired MS raw data were analysed using MaxQuant<sup>56</sup> (v. 1.6.17.0) and searched against the RUDB's. 205 The MaxLFQ algorithm was used to quantify proteins<sup>57</sup>. Detected protein groups were explored in 206 Perseus<sup>58</sup> (v. 1.6.8.0). Both RUDB's were supplemented with contaminant protein entries, such as 207 human keratin, trypsin, and bovine serum albumin, in addition to reversed sequences of all protein 208 209 entries for estimation of false discovery rates (FDR). Oxidation of methionine, protein N-terminal acetylation, deamination of asparagine and glutamine, and conversion of glutamine to pyroglutamic 210 211 acids were used as variable modifications, while carbomidomethylation of cysteine residues was used 212 as fixed modification. Trypsin was chosen as digestive enzyme and maximum missed cleavages 213 allowed was one. Protein groups identified as potential contaminants were removed. Proteins were 214 filtered to 1% FDR and considered valid if they had at least one unique peptide per protein and at least 215 one valid value in total. One sample originating from goat fed HPO diet (14201 P2 (Goat 2 fed HPO P2, 216 sample no. 22)) was deemed as a technical outlier, mapping significantly fewer protein groups in 217 metaproteomic analysis compared to the rest of the data and was therefore removed from the downstream analysis. After filtration, we resolved 1081 unique protein groups across the 16 samples 218 219 from cattle and 1632 unique protein groups across 15 samples from goats. Box plots for Figure 1 were 220 made with ggplot2<sup>59</sup> in R (v. 4.2.0)<sup>60</sup>. To determine which expressed metabolic pathways *E. caudatum* were significantly enriched for in each diet/animal, we used the hyperR package<sup>61</sup> in R which employs 221 222 the hypergeometric test. The 'geneset' for hyperR was generated by using the KEGGREST R package 223 to retrieve entries from the KEGG database and determine which pathways the E. caudatum KOs 224 belong to. The geneset was then manually curated to only include metabolic pathways of interest (i.e., 225 we remove pathways such as "Huntington disease"). For the 'background' setting in hyperR, to be 226 conservative, we used the total number of unique KOs (7592) in the *E. caudatum* genome that could 227 possibly be expressed.

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# 229 Animal trial, sample handling and metagenomic data generation for independent validating dataset

Samples were also analysed from previously performed feeding experiments with Holstein Friesian bulls<sup>62</sup>. In brief, these bulls were subjected to either *ad libitum* or restricted feeding regime in a compensatory growth model detailed in Keogh *et al.*, 2015<sup>62</sup>. Both feeding groups received the same ratio of concentrate and grass silage, respectively 70% and 30%, of which the concentrate was mainly composed of starch-rich rolled barley (72.5%) and soya (22.5%). Rumen samples were collected at slaughter and stored at -80C prior to metagenomics and metaproteomic analysis in this study.

237 Sample preparation, cell lysis and extraction of DNA was carried out as previously described by McCabe et al.<sup>63</sup> Quality check of fastq files and removal of low-quality reads was performed using fastp 238 239 (V.0.19.5). Sequence reads were mapped against the bovine genome (ARS-UCD1.3) using minimap2 240 (V.2.16), and host sequences were removed. Reads were co-assembled using Megahit (V1.2.6) with "-meta-large" pre-set option as the metagenome was complex. Metagenomic binning was applied to 241 242 the co-assembly using MetaBAT2 using standard parameters (V.2.12.1). MAGs were then dereplicated 243 using dRep (V.1.4.3), and the resulting MAGs were taxonomically annotation using Bin Annotation 244 Tool (BAT), available on (https://github.com/dutilh/CAT). This tool internally uses prodigal (V.2.6.3) 245 for gene prediction and DIAMOND (V.0.9.14) for the alignment against the non-redundant (nr) protein 246 database (As of Feb 2020).

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248 Sample preparation for metaproteomics was done by lysing cells with bead beating with two glass 249 bead sizes ( $\leq$ 106  $\mu$ m and 0.5 mm), in 100 mM Tris, pH8, 5% SDS and 10 mM DTT. A FastPrep 24 250 instrument was operated for 3 × 45 seconds at a speed of 6.5 m/s. The samples were centrifuged for 251 15 minutes at 20.000  $\times$  g and the protein extracts were cleaned by Wessel-Flügge precipitation<sup>64</sup>; 252 pellets were dissolved in 5% SDS, 100 mM Tris-Cl, pH8, 10 mM DTT and kept at -20 °C until further 253 processing. Protein digestion was performed using suspension trapping (STrap)<sup>65</sup>, dried in a SpeedVac (Eppendorf Concentrator Plus) and re-dissolved in 0.05 % trifluoroacetic acid, 2% acetonitrile for 254 255 peptide concentration estimation using a Nanodrop One instrument, and subsequent MS/MSanalysis. The samples were analyzed using an Ultimate3000 RSLCnano UHPLC coupled to a QExactive 256 257 hybrid quadrupole-orbitrap mass spectrometer (Thermo Fisher, Bremen, Germany) as described previously<sup>55</sup>. 258

259 Mass spectrometry raw data were analysed with a sequence of software in the Galaxy software suite (usegalaxy.eu). Initially, they were searched against the sample-specific protein sequence database 260 261 (1.773.447 protein sequences) with SearchGUI<sup>66</sup> utilizing the X!Tandem search engine<sup>67</sup> version Vengeance. The database was supplemented with contaminant protein entries, such as human 262 263 keratin, trypsin, and bovine serum albumin, in addition to reversed sequences of all protein entries 264 for estimation of false discovery rates (FDR). Oxidation of methionine and protein N-terminal acetylation were used as variable modifications, while carbomidomethylation of cysteine residues 265 were used as fixed modification. Trypsin was chosen as digestive enzyme, maximum missed cleavages 266 allowed was one and matching tolerance levels for MS and MS/MS were 10 ppm and 20 ppm, 267 respectively. PeptideShaker<sup>68</sup> was used to filter the results to 1% FDR and quantification was done 268 269 using FlashLFQ<sup>69</sup> including normalization between samples and the feature 'match between runs' to maximize protein identifications. Perseus<sup>58</sup> version 1.6.2.3 was used for further analysis. A protein 270

group was considered valid if it had at least one unique peptide identified and being quantified in at
least 50% of the replicates in at least one condition (7 restricted and 8 Ad lib). Protein groups identified
as potential contaminants were removed. Calculations of MAG abundances were done by summing
LFQ values for all proteins belonging to each MAG and differential abundance between diets were
detected by a two-sided Student's t-test (p<0.05).</li>

#### 276 **RESULTS AND DISCUSSION**

## 277 Protozoal populations have large proteomes in the rumen microbiome

278 Because of their large size protozoal species can comprise a significant fraction of the microbial biomass in the rumen<sup>9</sup>. While the total number and diversity of protozoal species are lesser than their 279 bacterial counterparts in the rumen, their genome size and total gene count are considerably larger 280 281 and due to alternative splicing and post-translational modifications, the protein representation of protozoal populations will be larger than the number of genes in the genome<sup>70</sup>. Thus, the amount of 282 protein in a protozoa species can be expected to far exceed the amount of protein in a bacterial 283 284 species that can be identified and quantified in proteomic studies. In this context, our metaproteomic 285 data showed an extensive fraction of detectable proteins affiliated to E. caudatum, and other closely 286 related species, in both cows (26.3%) and goats (31.5%) in proportion to the combined bacterial 287 species that were represented in our genome databases (Figure 1a). In addition, the label free quantification (LFQ) of *E. caudatum* proteins, which is indicative of protein detection intensity, was 288 289 proportionally higher than the bacterial fraction of the rumen microbiome further supporting the 290 dominance of protozoal activity in our samples (Figure 1b). Twice as many *E. caudatum* proteins were 291 detected in goat than cows (mean: 514 vs 284), however this was somewhat expected given the 7x 292 higher counts of entodiniomorph concentration (cells/mL) previously observed in the goat samples 293 compared to cows (**Table 1**)<sup>5</sup>.

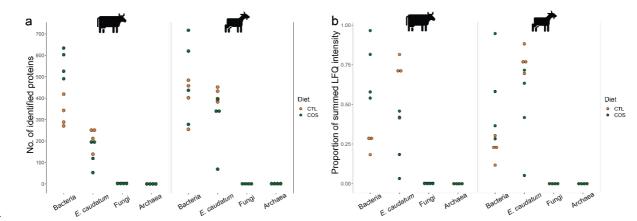


Figure 1. Quantities of proteins identified as *E. caudatum* in the rumen microbiome vary depending on host animal and dietary conditions. Boxplots for total proteins identified (a), and average recovered metaproteomic expression (b: presented as proportion of summed LFQ intensities) belonging to protozoal (*E. caudatum*), bacterial, archaeal, or fungal species across the control diet (CTL) and diets supplemented with corn oil and

wheat starch (COS) for dairy cows (n=4) and goats (n=4). Detected proteins LFQ intensities for protozoal and
 bacterial populations can be found in Supplementary Table S2.

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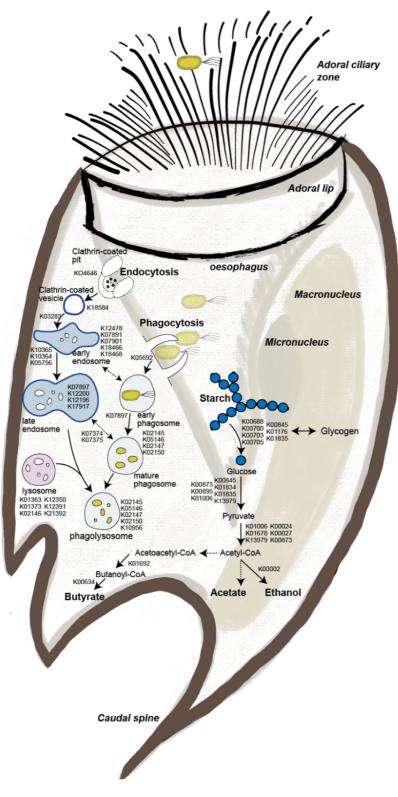
# 302 Metabolism of E. caudatum shows predatory activity and metabolism of VFAs

303 While previous efforts have investigated the genome and transcriptome of *E. caudatum* grown in monoculture<sup>14,71</sup>, our metaproteomic analysis sought to reveal *in vivo* metabolism and functions of *E*. 304 caudatum within the rumen microbiome. In accordance with Wang et al.<sup>71</sup>, our metaproteomic 305 306 analysis revealed expressed proteins significantly enriched in metabolic pathways such as carbon 307 metabolism, glycolysis/gluconeogenesis, starch and sucrose (and glycogen) metabolism, pyruvate 308 metabolism, oxidative phosphorylation and production of alcohol (Supplementary Table S3). Wang et 309 al. found that as for most rumen microbes, E. caudatum uses carbohydrates such as starch as its primary substrate, as well as cellulose and hemicellulose to a certain degree<sup>71</sup>, and their transcript 310 311 analyses showed that *E. caudatum* had high levels of expression of amylases and low-level expression 312 of hemicellulases, cellulases and pectinases. Similarly, our metaproteomic analysis reveals expression 313 of amylases by *E. caudatum* that are predicted to enable *E. caudatum* to engulf and degrade starch granules to simpler sugars and to produce glycogen, its most important storage carbohydrate<sup>72</sup>. 314 However, no detection of *E. caudatum* carbohydrate active enzymes (CAZymes) related to 315 316 hemicellulose or pectin were observed in any of our metaproteomes, suggesting that it is not engaging in the deconstruction of these carbohydrates at the time our samples were collected for analysis 317 (before feeding). It should be noted that ruminal fermentation activity as well as production of VFA's 318 and methane will be at its highest after feeding, as a result of an increased availability of fermentable 319 320 substrate<sup>73</sup>. While sampling time can influence the recovered microbial composition and hence 321 function, any differences in metabolic parameters or species abundance in this study is relative across 322 both diets given the consistent sampling times.

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324 While monoculture cultures of E. caudatum have not been established to verify the VFA's it can 325 produce, Wang et al. found transcripts of enzymes involved in fermentative formation of acetate and 326 butyrate<sup>71</sup>. Similarly, we detected proteins inferred in metabolism of acetate, butyrate, and alcohol in 327 E. caudatum. Irrespective of host, animals fed the control (CTL) diet had a higher proportion of E. 328 caudatum proteins and concurrently had increased relative levels of acetate and butyrate compared 329 to animals fed the corn oil and wheat starch diet (COS), which had fewer E. caudatum proteins and lower acetate/butyrate levels (Figure 1 and Table 1). As E. caudatum was seemingly most abundant 330 331 in goats fed the CTL diet, we used these metaproteomes to reconstruct metabolic features (Figure 2). 332 Of the 514 E. caudatum proteins identified in goats, 454 had unique KO numbers assigned, from which KEGG Mapper reconstructions<sup>50</sup> enabled functional assignment of 268 proteins to metabolic 333

334 pathways. Our metabolic reconstructions showed expressed proteins involved in endocytosis, 335 phagosome and lysosome processes for predatory activity, engulfment, and digestion of bacteria 336 (Supplementary Table S2). Interestingly, for the rumen samples used in this study Martin et al. previously observed higher NH<sub>3</sub> concentrations in goats compared to cows<sup>5</sup> and hypothesised that it 337 might have resulted from increased bacterial protein breakdown and feed protein degradability due 338 339 to higher density of entodiniomorphs known for their predatory activity<sup>5</sup>. In support of these observations, we performed metaproteomic pathway enrichment analysis of E. caudatum (Figure 2, 340 341 Supplementary Table S3), which revealed significantly enriched nitrogen metabolism, in addition to 342 purine and pyridine metabolism in goats but not in cows. Other biological processes such as signalling 343 and metabolism of amino acids, and amino and nucleotide sugars represented significantly enriched 344 pathways in *E. caudatum* (Supplementary Table S3). In the previous transcriptome study by Wang *et* 345 al., transcripts for a ferredoxin hydrolase and an iron hydrogenase were recovered and are suspected 346 to be involved in production of hydrogen. Here in our metaproteomic analysis, we identified only one 347 of its eight iron hydrogenases (in goats, it was absent in cows, Supplementary Table S2), which showed no contrasting changes in LFQ intensity in either the CTL or COS datasets, contributing to the 348 349 uncertainty that *E. caudatum* is a major producer of hydrogen, despite previous reports associating its abundance with higher methane levels 74-76. 350



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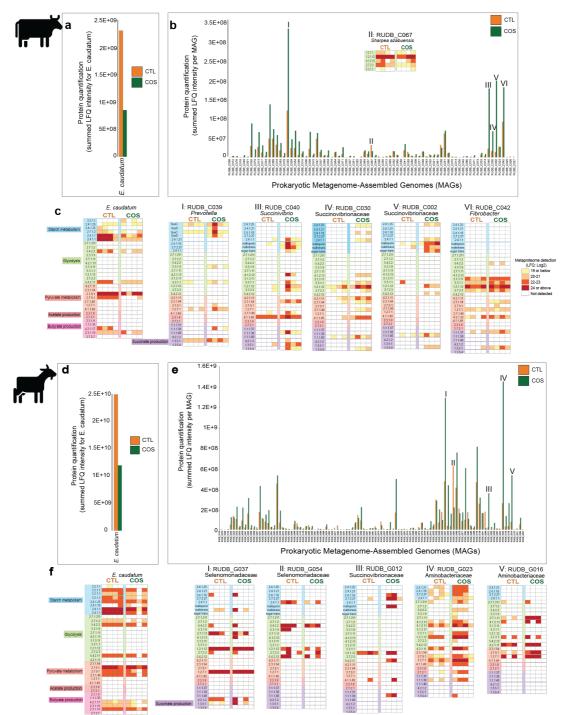
Figure 2. Reconstructed phagolysosome formation and starch metabolism of *Entodinium caudatum* within the rumen microbiome of goats fed the control diet (CTL) based on metaproteomic analysis. KO identifiers for identified proteins were analysed via KEGG mapper to reconstruct expressed key features in the metabolism of *E. caudatum*. Dashed arrows represent proteins or pathways that were not detected in our metaproteomes but are key steps in their respective pathways. Detailed information connecting KO identifiers to their respective gene ID, LFQ and animal/diet can be found in **Supplementary Table S2**.

# 360 E. caudatum is less active in diets supplemented with starch regardless of its starch degrading 361 reputation.

362 The changes in VFA and methane levels in animals fed the high starch COS diet, previously measured 363 by Martin *et al.*<sup>5</sup>, suggested significant alterations in composition and thus functions of the rumen microbiome irrespective of host species. In particular, a decrease in proportions of acetate and 364 365 butyrate, decrease in the acetate:propionate ratio and an increase in proportional propionate levels 366 were observed in animals fed the COS diet, compared to the CTL diet (**Table 1**). Diets that are high in 367 starch content or with low forage:concentrate ratios have previously been shown to result in higher production of propionate and succinate, as they are easily fermented in the rumen and accordingly 368 have high passage rates<sup>77,78</sup>. We therefore leveraged our genome-centric metaproteomic data from 369 370 both cows (Figure 3a-c) and goats (Figure 3d-f) fed either the COS or CTL diet to gain an overview of 371 protein expression from individual populations. We specifically focused on pathways involved in the 372 degradation of starch (CTL: corn starch, COS: corn + wheat starch) to pyruvate through glycolysis and 373 finally formation of acetate, butyrate, and propionate (via succinate). Irrespective of host, and despite its starch-degrading reputation<sup>71,72</sup>, *E. caudatum* had a lower abundance and less proteins involved in 374 starch degradation in animals fed the COS diet compared to those fed the CTL diet (Figure 3a and 3d). 375 376 Further, we observed opposing patterns for *E. caudatum* proteins involved in glycolysis, and production of pyruvate, acetate, and butyrate, which were detected in higher levels in both cows and 377 378 goats fed the CTL diet compared to the starch and corn oil (COS) supplemented diet.

379 While several putative E. caudatum amylases were detected across all animals and diets, their 380 quantification levels (i.e., LFQ intensities) did not increase as expected when higher levels of starch 381 were available (Figure 3a and d). We therefore hypothesized that the observed shift in VFA profiles in 382 response to increased starch was additionally influenced by the bacterial fraction of the rumen 383 microbiome. In contrast to lower *E. caudatum* levels in the animals fed the COS diet, we observed an 384 increase in suspected starch-degrading bacterial species, and succinate- and propionate-producing 385 bacterial species irrespective of host (Figure 3c and 3f). For example, starch fermentation pathways 386 from population genomes affiliated with the Succinivibrionaceae family, Prevotella species, Fibrobacter species and, additionally for goats, members of the Selenomonadaceae and 387 388 Aminobacteriaceae families, were detected at higher proteomic levels in the animals fed the COS diet 389 compared to those fed the CTL diet (Figure 3c and 3f).

[13]



390

391 Figure 3. Detected proteins mapped to the genome of *E. caudatum* and bacterial metagenome-assembled 392 genomes (MAGs) in the rumen microbiome of dairy cattle (n=4) and goats (n=4) fed either a control diet (CTL) 393 or one supplemented with corn oil and wheat starch (COS). The figure displays metabolically active populations 394 (as genomes or MAGs), with selected expressed proteins (presented as Enzyme Commission (EC) number) active 395 in starch degradation, glycolysis and production of pyruvate, butyrate, acetate, and succinate in cows (a-c) and 396 goats (d-f) fed CTL or COS diets. Panels a and d depict E.caudatum proteomes that were detected in cattle and 397 goats respectively are presented separately to bacteria (panels **b** and **e**) as the scale of their protein 398 quantification values were ~10x larger. Protein quantification values (y-axis) were calculated by considering both 399 the number of proteins detected per MAG/genome and their LFQ intensity: we averaged LFQ intensities for each 400 detected protein across biological replicates for each dietary condition (CTL: green or COS: orange), which were 401 subsequently summed for all detected proteins per MAG/genome. Panels c and f show selected MAGs (I-VI) with 402 metabolically active proteins, presented as EC numbers, recovered from cows (RUDB-C) and goats (RUDB-G) fed

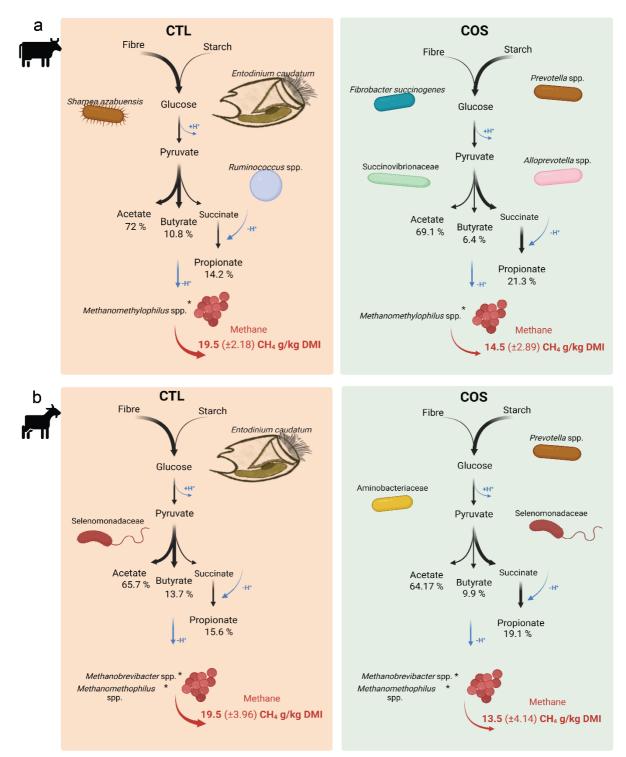
403 either CTL or COS diets. MAGs are presented with their MAG ID and taxonomic annotation from GTDB-tk.
 404 Genome annotations and LFQ intensities used to create panels a-f can be found in Supplementary Table S2.

405

#### 406 E. caudatum is less active in animals that produce lower methane yield

407 For the animals sampled in this study, Martin et al. demonstrated a ~25-30% reduction in methane 408 emissions in both cows and goats fed the COS diet compared to the control (**Table 1**)<sup>5</sup>. While our 409 proteomic evidence clearly showed a lower E. caudatum activity in COS-fed low-methane producing 410 animals, a specific mechanism that explains this phenomenon is still elusive. Previous comparisons between defaunated and faunated animals have shown decrease in methane production in protozoa-411 412 free ruminants, suggesting symbiotic interactions between methanogenic archaea and protozoal species<sup>74</sup>. Methanogen's epi- and endo-symbiotic relationships with protozoa have also been 413 suggested to contribute to 9-37% of rumen methanogenesis<sup>74,75,79,80</sup>. Moreover, studying microcosms 414 with the presence and absence of protozoal species Solomon *et al.* reported higher levels of acetate 415 416 and butyrate in microcosms with protozoa present in addition to increased methane emissions<sup>74</sup>, which supports the main findings of animals fed the CTL diet in this study (Figure 4). It is tempting to 417 speculate that such protozoal-methanogen relationships in this study are centred on hydrogen 418 419 transfer. However, we observed minimal evidence in our proteomic data that E. caudatum makes major contributions to ruminal hydrogen production that is linked to methane levels, with only one of 420 421 its eight iron hydrogenases detected in goats (absent in cattle), which showed no changes in LFQ 422 intensity in either the high (CTL) or low (COS) methane yielding animals.

423 Increases in dietary starch for ruminants is known to stimulate the propionate and succinate pathways 424 of starch-degrading bacteria, which due to their net incorporation of metabolic hydrogen [H] represent a [H] sink in rumen fermentation besides hydrogenotrophic methanogenesis<sup>79,81</sup>. In addition 425 to starch, in a study conducted by Zhang et al.<sup>82</sup>, goats fed corn oil as a supplement decreased ruminal 426 H<sub>2</sub> concentrations and total methane emissions. Nevertheless, there was seemingly no effect on 427 428 rumen protozoal populations, which suggests that corn oil does not act as an anti-protozoal agent, with the dose of corn oil used in this study<sup>82</sup>. Furthermore, supplementation of dietary lipids can 429 430 decrease plant fibre degradation and hence levels of acetate and butyrate at the expense of 431 propionate production, as lipid-derived long-chain fatty acids can be toxic to keystone fibre degrading gram-positive bacterial species<sup>83,84</sup>. These findings were in agreement with the decreased CH<sub>4</sub> 432 production in cows and goats in this study fed the COS diet, which was observed to additionally impact 433 434 other ruminal fermentation parameters, such as increased propionate and decreased butyrate and acetate levels (Figure 4)<sup>5</sup>. 435





437 Figure 4. Schematic overview of the overall predicted metabolism in the rumen microbiome of cows (Panel a) 438 and goats (Panel b) fed the control diet (CTL) compared to those fed the diet supplemented with corn oil and 439 wheat starch (COS). The dominant microorganisms, as determined via MAG-centric metaproteomics, were 440 predicted to convert starch into volatile fatty acids (VFAs) and methane in the rumen microbiome. However, the 441 taxonomic and VFA profile of the rumen microbiomes differed when their host animals were subjected to 442 different levels of starch in their diet. Thicker arrows represent higher abundance of metabolites. VFA 443 concentrations were determined using gas chromatography. Percentages of VFA concentrations can be found 444 in Supplementary Table S1. Percentages of VFA concentrations and methane yield are presented at average 445 values, and numbers in parentheses are standard deviation for measured values for methane yield from each 446 diet. \* Represented by few detected proteins in the metaproteomic analysis.

#### 447

448 Diets rich in starch are more fermentable in the rumen, which can decrease the ruminal pH to levels that can inhibit methanogenic archaea and fibre-degrading bacterial species<sup>85,86</sup>. Yet, lowered pH 449 450 levels in the rumen can also lead to clinical (or sub-clinical in most production scenarios) ruminal 451 acidosis<sup>87,88</sup>. Hence, high concentrate diets, which increase production of propionate at the expense 452 of methane, does not necessarily opt for a viable methane mitigation strategy in the long term. Our 453 results suggests that decreased methanogenesis in COS-fed animals is likely due to a decrease in available hydrogen and/or decrease in pH levels, which we predict is caused by the metabolism of 454 dominant wheat starch-degrading populations that likely do not produce exogenous hydrogen due to 455 their own [H]-utilizing succinate and propionate metabolism (Figure 4). 456

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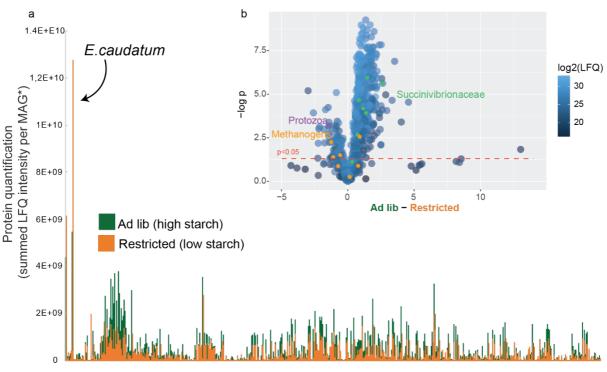
# 458 E. caudatum dominance is validated in geographically independent datasets

459 To further test our hypothesis that *E. caudatum* plays a central role in the rumen ecosystem, we 460 explored additional metagenome-centric metaproteomic datasets originating from an independent feeding experiment performed in Ireland on 60 Holstein Friesian bulls<sup>62</sup>. In brief, these bulls were 461 462 subjected to the same ratio of concentrate and grass silage at either an *ad libitum* or restricted feeding regime in a compensatory growth model detailed in Keogh et al, 2015<sup>62</sup>. We applied the same strategy 463 as for the described Holstein dairy cows and alpine goats to resolve the metaproteomic dataset for a 464 subset of 15 animals (7 restricted and 8 Ad libitum) against 781 reconstructed sample-specific MAGs 465 466 (RUDB-HF), which were supplemented with the genome of E. caudatum, as well as genomes of 467 available anaerobic fungi. This collection of microbial prokaryote and eukaryote genomes was then 468 used as a sequence database for the generated protein spectra. Consistent with our previous 469 observation, a substantial proportion of the detected proteins were affiliated to E. caudatum 470 providing further support that Entodinium is an important and metabolically active contributor to the 471 rumen microbiome. Intriguingly, the protein quantification (measured as sum of LFQ intensities 472 affiliated to each MAG/genome, averaged for each diet) was twice as high in the rumen sample from 473 bulls on the restricted diet, which likely had less starch available compared to the ad libitium group 474 and a higher retention time (Figure 5a). A previously published 16S rRNA amplicon investigation of the phylogenetic differences between the rumen microbiomes of these two diet groups highlighted 475 an increase in *Succinivibrionaceae* in the starch-rich *ad libitium* diet<sup>63</sup>. Our metaproteomic analysis 476 confirmed a significantly higher (p < 0.05) proteomic detection of several Succinivibrionaceae-MAGs 477 478 under the *ad libitium* group (Figure 5b), accompanied with a reduced acetate:propionate ratio in the 479 rumen, which is often associated with increased feed efficiency and reduced production of methane<sup>63</sup>. 480 These observations largely mirror the dominance of Succinivibrionaceae-MAGs in the dairy cattle and

481 goats fed the COS diet, further strengthening our hypothesis that *E. caudatum* does not metabolically

482 respond to increases in available starch in the host animals' diets and has other roles than being a

- 483 primary starch degrader.
- 484



# 485

Eukaryota and prokaryota Metagenome-Assembled Genomes (MAGs)

486 Figure 5. The proteomes of Entodinium caudatum and other rumen microbiome populations from Holstein-487 Friesian beef cattle are affected by high starch diets. A total of 60 beef cattle were subjected to two dietary 488 contrasting condition: 30 animals with ad libitum feeding and 30 subjected to 125 days of feed restriction. 489 Dietary components in both treatments consisted of 70% concentrate, and 30% grass silage, with the 490 concentrate containing rolled barley 72.5%, soya 22.5%, molasses 3% and calf mineral 2%. Rolled barley is high 491 in energy and starch content (~50%). a. Metaproteomes for a subset of 15 animals (7 restricted and 8 ad libitium) 492 were analysed against a database of 781 MAGs and isolate genomes, including eukaryotic representatives such 493 as E. caudatum. Protein quantification values (y-axis) were calculated by considering both the number of 494 proteins detected per MAG (and *E. caudatum*) and their LFQ intensity; we averaged LFQ intensities for each 495 detected protein across biological replicates for each dietary condition (Ad lib: green or restricted: orange), 496 which were subsequently summed for all detected proteins per MAG. Similar to our observations in Holstein 497 dairy heifers and Alpine goats (Figure 3), the proteome of *E. caudatum* was a major fraction of the total rumen 498 metaproteome, however it was substantially reduced in dietary conditions where starch content was higher. b. 499 Volcano plot indicating different rumen microbiome proteins that displayed both large magnitude of fold-500 changes in LFQ intensities (x axis) and high statistical significance (-log10 of p values using a t-test, y axis, dashed 501 horizontal line denote a p<0.05 cut-off). Supporting our results in dairy cattle and goats, we observed in high-502 starch conditions an increase in protein detection for populations affiliated to the Succinivibrionaceae (green) 503 compared to the *E. caudatum* (purple) and methanogens (orange), which were detected at higher LFQ intensities 504 in restricted dietary conditions. LFQ intensities used to create panel a can be found in Supplementary Table S4. 505

# 506 E. caudatum seemingly has preferential bacterial species it will predate.

507 *E. caudatum* is renowned for its predatory activity and is acknowledged as the most abundant 508 protozoa in the rumen, whereby it has been estimated that 0.1% of rumen prokaryotes are digested 509 by the rumen protozoal population every minute <sup>89</sup>. Although suspected of having metabolic 510 interactions with methanogenic archaea, several protozoal populations such as Entodinium are 511 hypothesized as having associations with certain members of the Gram negative 512 Gammaproteobacteria, which multiple studies have speculated are resistant to protozoal engulfment<sup>74,90,91</sup>. In contrast, Gutierrez and Davis previously demonstrated that *Entodinium*-species 513 514 engulf Gram positive starch-degraders<sup>91</sup>. In the context of our data, we speculate that CTL fed animals 515 provided E. caudatum optimal conditions for predation, whereas increased starch levels in the COS 516 diets facilitated Gram-negative starch-degraders resistant to protozoal engulfment and/or reduced pH levels. Such a scenario would enable populations of Succinivibrionaceae in cattle and/or 517 Aminobacteriaceae in goats to exploit the "predation free" COS diet and could plausibly explain the 518 519 observations of higher propionate levels, less methane, and lower activity of *E. caudatum*.

520 In conclusion, by using a (meta)genome-centric metaproteomics approach we primarily investigated 521 the role of the rumen protozoa *E. caudatum* in the rumen microbiome of beef and dairy cattle as well 522 as dairy goats that were subjected to varying dietary conditions. We showed that the proteome of E. 523 caudatum constitutes a substantial fraction of the recovered rumen microbial proteome, which 524 supports previous 16S/18S rRNA gene-based rumen census data that have highlighted its global 525 dominance across a plethora of ruminant species. However, E. caudatum proteins were surprisingly 526 detected at lower levels in animals that were fed increased levels of wheat starch, despite its reputable 527 starch-degrading capabilities (Figures 3-5). We hypothesize that this scenario is likely caused by the 528 out competition of *E. caudatum* by Gram-negative starch-degrading bacterial species that are possibly 529 resistant to protozoal engulfment and/or lower pH levels, creating sub-optimal conditions for E. 530 caudatum. We also observed limited evidence of *E. caudatum* metabolism being directly linked to 531 higher CH<sub>4</sub> yield at the time of sampling in this study (prior to feeding). However, the abundance of E. 532 caudatum in high methane-emitting animals may be indirectly fuelled in instances where preferential 533 pH conditions also support methanogens and fibrolytic bacteria that are also known to produce 534 hydrogen. Similarly, our data further support the theories that certain Gram-negative bacterial species 535 are resistant to predation by E. caudatum, which could enable specific niches for succinate- and propionate-producing populations to flourish, subsequently exerting a larger impact on hydrogen and 536 537 methane metabolisms in the rumen microbiome. While much work is still needed to confirm our 538 abovementioned hypotheses, our integrated metaproteomics approaches have demonstrated the 539 future importance of including eukaryote populations for accurate and meaningful analyses of the 540 rumen microbiome and its impact on GHG mitigation strategies and host productivity traits.

541

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562

563 The authors declare no conflicts of interest.

564

#### 565 **Data Availability**

566 Raw shotgun metagenomic data has been deposited in the National Center for Biotechnology 567 Sequence Read Archive (NCBI-SRA) under accessions numbers SRR19524239 to SRR19524270 with 568 links to BioProject accession number PRJNA844951. All annotated prokaryote MAGs are available 569 publicly at <u>DOI: 10.6084/m9.figshare.20066972.v1</u>. The mass spectrometry proteomics data have 570 been deposited to the ProteomeXchange Consortium via the PRIDE<sup>92</sup> partner repository with the 571 dataset identifiers PXD034544, PXD034779 and PXD034642.

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# 573 **REFERENCES**

- 5741Bergman, E. N. Energy contributions of volatile fatty acids from the gastrointestinal tract in575various species. *Physiol Rev* **70**, 567-590 (1990).
- 5762Wallace, R. J. *et al.* The rumen microbial metagenome associated with high methane577production in cattle. *BMC Genomics* **16**, 839 (2015).

578	3	Jami, E., White, B. A. & Mizrahi, I. Potential role of the bovine rumen microbiome in
579		modulating milk composition and feed efficiency. <i>PLoS One</i> <b>9</b> , e85423 (2014).
580	4	McCann, J. C. et al. Induction of Subacute Ruminal Acidosis Affects the Ruminal Microbiome
581	_	and Epithelium. Front Microbiol 7, 701 (2016).
582	5	Martin, C. et al. Diets supplemented with corn oil and wheat starch, marine algae, or
583		hydrogenated palm oil modulate methane emissions similarly in dairy goats and cows, but
584	-	not feeding behavior. Animal Feed Science and Technology 272, 114783 (2021).
585	6	Seshadri, R. <i>et al.</i> Cultivation and sequencing of rumen microbiome members from the
586	_	Hungate1000 Collection. Nat Biotechnol <b>36</b> , 359-367 (2018).
587	7	Stewart, R. D. et al. Compendium of 4,941 rumen metagenome-assembled genomes for
588	_	rumen microbiome biology and enzyme discovery. <i>Nat Biotechnol</i> <b>37</b> , 953-961 (2019).
589	8	Xie, F. <i>et al.</i> An integrated gene catalog and over 10,000 metagenome-assembled genomes
590		from the gastrointestinal microbiome of ruminants. <i>Microbiome</i> <b>9</b> , 137 (2021).
591	9	Williams, A. G. & Coleman, G. S. in <i>The rumen microbial ecosystem</i> 73-139 (Springer,
592		1997).
593	10	Lin, C. Z., Raskin, L. & Stahl, D. A. Microbial community structure in gastrointestinal tracts of
594		domestic animals: Comparative analyses using rRNA-targeted oligonucleotide probes. Fems
595		Microbiology Ecology <b>22</b> , 281-294 (1997).
596	11	Hagen, L. H. et al. Proteome specialization of anaerobic fungi during ruminal degradation of
597		recalcitrant plant fiber. ISME J 15, 421-434 (2021).
598	12	Saye, L. M. G. et al. The Anaerobic Fungi: Challenges and Opportunities for Industrial
599		Lignocellulosic Biofuel Production. <i>Microorganisms</i> 9, 694 (2021).
600	13	Stabel, M. et al. Aestipascuomyces dupliciliberans gen. nov., sp. nov., the First Cultured
601		Representative of the Uncultured SK4 Clade from Aoudad Sheep and Alpaca.
602		Microorganisms <b>8</b> , 1734 (2020).
603	14	Park, T., Wijeratne, S., Meulia, T., Firkins, J. L. & Yu, Z. The macronuclear genome of
604		anaerobic ciliate Entodinium caudatum reveals its biological features adapted to the distinct
605	. –	rumen environment. <i>Genomics</i> <b>113</b> , 1416-1427 (2021).
606	15	Henderson, G. et al. Rumen microbial community composition varies with diet and host, but
607		a core microbiome is found across a wide geographical range. <i>Sci Rep</i> <b>5</b> , 14567 (2015).
608	16	Ranilla, M. J., Jouany, J. P. & Morgavi, D. P. Methane production and substrate degradation
609		by rumen microbial communities containing single protozoal species in vitro. <i>Lett Appl</i>
610	47	<i>Microbiol</i> <b>45</b> , 675-680 (2007).
611	17	Park, T., Meulia, T., Firkins, J. L. & Yu, Z. Inhibition of the rumen ciliate Entodinium caudatum
612	40	by antibiotics. Frontiers in microbiology 8, 1189 (2017).
613	18	Fougere, H. & Bernard, L. Effect of diets supplemented with starch and corn oil, marine
614		algae, or hydrogenated palm oil on mammary lipogenic gene expression in cows and goats:
615	40	A comparative study. <i>J Dairy Sci</i> <b>102</b> , 768-779 (2019).
616	19	Fougere, H., Delavaud, C. & Bernard, L. Diets supplemented with starch and corn oil, marine
617		algae, or hydrogenated palm oil differentially modulate milk fat secretion and composition
618	20	in cows and goats: A comparative study. <i>J Dairy Sci</i> <b>101</b> , 8429-8445 (2018).
619	20	Solomon, K. V. <i>et al.</i> Early-branching gut fungi possess a large, comprehensive array of
620	24	biomass-degrading enzymes. Science <b>351</b> , 1192-1195 (2016).
621	21	Haitjema, C. H. <i>et al.</i> A parts list for fungal cellulosomes revealed by comparative genomics.
622	22	Nat Microbiol <b>2</b> , 17087 (2017).
623	22	Youssef, N. H. <i>et al.</i> The genome of the anaerobic fungus Orpinomyces sp. strain C1A reveals
624 625		the unique evolutionary history of a remarkable plant biomass degrader. Appl Environ
625 626	22	Microbiol <b>79</b> , 4620-4634 (2013).
626 627	23	Hooker, C. A. <i>et al.</i> Hydrolysis of untreated lignocellulosic feedstock is independent of S-
627 628		lignin composition in newly classified anaerobic fungal isolate, Piromyces sp. UH3-1. Biotechnol Biofuels <b>11</b> , 293 (2018).
020		

629	24	Brown, J. L. et al. Cocultivation of the anaerobic fungus Caecomyces churrovis with
630		Methanobacterium bryantii enhances transcription of carbohydrate binding modules,
631		dockerins, and pyruvate formate lyases on specific substrates. Biotechnol Biofuels 14, 234
632		(2021).
633	25	Wilken, S. E. <i>et al.</i> Experimentally Validated Reconstruction and Analysis of a Genome-Scale
634		Metabolic Model of an Anaerobic Neocallimastigomycota Fungus. <i>mSystems</i> 6 (2021).
635	26	Yu, Z. & Morrison, M. Improved extraction of PCR-quality community DNA from digesta and
636	20	fecal samples. <i>Biotechniques</i> <b>36</b> , 808-812 (2004).
637	27	Morgavi, D. P., Jouany, J. P. & Martin, C. Changes in methane emission and rumen
638	27	fermentation parameters induced by refaunation in sheep. Australian Journal of
639		Experimental Agriculture <b>48</b> , 69-72 (2008).
	20	
640	28	Bolger, A. M., Lohse, M. & Usadel, B. Trimmomatic: a flexible trimmer for Illumina sequence
641	20	data. Bioinformatics <b>30</b> , 2114-2120 (2014).
642	29	Li, D., Liu, C. M., Luo, R., Sadakane, K. & Lam, T. W. MEGAHIT: an ultra-fast single-node
643		solution for large and complex metagenomics assembly via succinct de Bruijn graph.
644		Bioinformatics <b>31</b> , 1674-1676 (2015).
645	30	Langmead, B. & Salzberg, S. L. Fast gapped-read alignment with Bowtie 2. Nat Methods <b>9</b> ,
646		357-359 (2012).
647	31	Li, H. et al. The Sequence Alignment/Map format and SAMtools. Bioinformatics 25, 2078-
648		2079 (2009).
649	32	Wu, Y. W., Simmons, B. A. & Singer, S. W. MaxBin 2.0: an automated binning algorithm to
650		recover genomes from multiple metagenomic datasets. <i>Bioinformatics</i> <b>32</b> , 605-607 (2016).
651	33	Kang, D. D. et al. MetaBAT 2: an adaptive binning algorithm for robust and efficient genome
652		reconstruction from metagenome assemblies. <i>PeerJ</i> 7, e7359 (2019).
653	34	Alneberg, J. et al. Binning metagenomic contigs by coverage and composition. Nat Methods
654		<b>11</b> , 1144-1146 (2014).
655	35	Sieber, C. M. K. et al. Recovery of genomes from metagenomes via a dereplication,
656		aggregation and scoring strategy. Nat Microbiol <b>3</b> , 836-843 (2018).
657	36	Johnson, M. <i>et al.</i> NCBI BLAST: a better web interface. <i>Nucleic Acids Res</i> <b>36</b> , W5-9 (2008).
658	37	Hyatt, D., LoCascio, P. F., Hauser, L. J. & Uberbacher, E. C. Gene and translation initiation site
659	•	prediction in metagenomic sequences. <i>Bioinformatics</i> <b>28</b> , 2223-2230 (2012).
660	38	Matsen, F. A., Kodner, R. B. & Armbrust, E. V. pplacer: linear time maximum-likelihood and
661	00	Bayesian phylogenetic placement of sequences onto a fixed reference tree. <i>BMC</i>
662		Bioinformatics <b>11</b> , 538 (2010).
663	39	Parks, D. H., Imelfort, M., Skennerton, C. T., Hugenholtz, P. & Tyson, G. W. CheckM:
664	55	assessing the quality of microbial genomes recovered from isolates, single cells, and
		metagenomes. <i>Genome Res</i> <b>25</b> , 1043-1055 (2015).
665 666	40	-
666	40	Parks, D. H. <i>et al.</i> A standardized bacterial taxonomy based on genome phylogeny
667		substantially revises the tree of life. <i>Nat Biotechnol</i> <b>36</b> , 996-1004 (2018).
668	41	Parks, D. H. <i>et al.</i> A complete domain-to-species taxonomy for Bacteria and Archaea. <i>Nature</i>
669		biotechnology <b>38</b> , 1079-1086 (2020).
670	42	Bowers, R. M. et al. Minimum information about a single amplified genome (MISAG) and a
671		metagenome-assembled genome (MIMAG) of bacteria and archaea. Nat Biotechnol 35, 725-
672		731 (2017).
673	43	Shaffer, M. et al. DRAM for distilling microbial metabolism to automate the curation of
674		microbiome function. Nucleic Acids Res 48, 8883-8900 (2020).
675	44	Zhang, H. et al. dbCAN2: a meta server for automated carbohydrate-active enzyme
676		annotation. Nucleic Acids Res 46, W95-W101 (2018).
677	45	Mistry, J. et al. Pfam: The protein families database in 2021. Nucleic Acids Res 49, D412-D419
678		(2021).

679	46	Suzek, B. E. et al. UniRef clusters: a comprehensive and scalable alternative for improving
680		sequence similarity searches. Bioinformatics <b>31</b> , 926-932 (2015).
681	47	Rawlings, N. D. et al. The MEROPS database of proteolytic enzymes, their substrates and
682		inhibitors in 2017 and a comparison with peptidases in the PANTHER database. Nucleic Acids
683		<i>Res</i> <b>46</b> , D624-D632 (2018).
684	48	Aramaki, T. et al. KofamKOALA: KEGG Ortholog assignment based on profile HMM and
685		adaptive score threshold. Bioinformatics 36, 2251-2252 (2020).
686	49	Kanehisa, M., Sato, Y. & Morishima, K. BlastKOALA and GhostKOALA: KEGG Tools for
687		Functional Characterization of Genome and Metagenome Sequences. J Mol Biol 428, 726-
688		731 (2016).
689	50	Kanehisa, M., Sato, Y. & Kawashima, M. KEGG mapping tools for uncovering hidden features
690		in biological data. Protein Sci <b>31</b> , 47-53 (2022).
691	51	Nordberg, H. <i>et al.</i> The genome portal of the Department of Energy Joint Genome Institute:
692	51	2014 updates. Nucleic Acids Res <b>42</b> , D26-31 (2014).
693	52	Peng, X. F. <i>et al.</i> Genomic and functional analyses of fungal and bacterial consortia that
694	52	enable lignocellulose breakdown in goat gut microbiomes. <i>Nature Microbiology</i> <b>6</b> , 499-+
695		(2021).
696	53	Andersen, T. O., Kunath, B. J., Hagen, L. H., Arntzen, M. O. & Pope, P. B. Rumen
	22	
697		metaproteomics: Closer to linking rumen microbial function to animal productivity traits.
698	<b>F</b> 4	Methods <b>186</b> , 42-51 (2021).
699	54	Mićić, M., Whyte, J. D. & Karsten, V. in <i>Sample Preparation Techniques for Soil, Plant, and</i>
700		Animal Samples 99-116 (Springer, 2016).
701	55	Michalak, L. et al. Microbiota-directed fibre activates both targeted and secondary metabolic
702		shifts in the distal gut. Nat Commun 11, 5773 (2020).
703	56	Cox, J. & Mann, M. MaxQuant enables high peptide identification rates, individualized p.p.b
704		range mass accuracies and proteome-wide protein quantification. Nat Biotechnol 26, 1367-
705		1372 (2008).
706	57	Cox, J. et al. Accurate proteome-wide label-free quantification by delayed normalization and
707		maximal peptide ratio extraction, termed MaxLFQ. Mol Cell Proteomics 13, 2513-2526
708		(2014).
709	58	Tyanova, S. et al. The Perseus computational platform for comprehensive analysis of
710		(prote)omics data. <i>Nat Methods</i> <b>13</b> , 731-740 (2016).
711	59	ggplot2: Elegant Graphics for Data Analysis (Springer-Verlag New York, 2016).
712	60	Team, R. C. R: A language and environment for statistical computing. (2013).
713	61	Federico, A. & Monti, S. hypeR: an R package for geneset enrichment workflows.
714	-	Bioinformatics <b>36</b> , 1307-1308 (2020).
715	62	Keogh, K., Waters, S. M., Kelly, A. K. & Kenny, D. A. Feed restriction and subsequent
716	02	realimentation in Holstein Friesian bulls: I. Effect on animal performance; muscle, fat, and
717		linear body measurements; and slaughter characteristics. J Anim Sci <b>93</b> , 3578-3589 (2015).
718	63	McCabe, M. S. <i>et al.</i> Illumina MiSeq Phylogenetic Amplicon Sequencing Shows a Large
719	03	Reduction of an Uncharacterised Succinivibrionaceae and an Increase of the
720		Methanobrevibacter gottschalkii Clade in Feed Restricted Cattle. <i>PLoS One</i> <b>10</b> , e0133234
721	<b>C A</b>	(2015).
722	64	Wessel, D. & Flugge, U. I. A method for the quantitative recovery of protein in dilute solution
723		in the presence of detergents and lipids. <i>Anal Biochem</i> <b>138</b> , 141-143 (1984).
724	65	Zougman, A., Selby, P. J. & Banks, R. E. Suspension trapping (STrap) sample preparation
725		method for bottom-up proteomics analysis. <i>Proteomics</i> 14, 1006-1000 (2014).
726	66	Barsnes, H. & Vaudel, M. SearchGUI: A Highly Adaptable Common Interface for Proteomics
727		Search and de Novo Engines. <i>J Proteome Res</i> <b>17</b> , 2552-2555 (2018).

728	67	Fenyo, D. & Beavis, R. C. A method for assessing the statistical significance of mass
729		spectrometry-based protein identifications using general scoring schemes. Anal Chem 75,
730		768-774 (2003).
731	68	Vaudel, M. et al. PeptideShaker enables reanalysis of MS-derived proteomics data sets. Nat
732		Biotechnol <b>33</b> , 22-24 (2015).
733	69	Millikin, R. J., Solntsev, S. K., Shortreed, M. R. & Smith, L. M. Ultrafast Peptide Label-Free
734		Quantification with FlashLFQ. J Proteome Res 17, 386-391 (2018).
735	70	Harper, J. W. & Bennett, E. J. Proteome complexity and the forces that drive proteome
736		imbalance. <i>Nature</i> <b>537</b> , 328-338 (2016).
737	71	Wang, L. L. et al. The transcriptome of the rumen ciliate Entodinium caudatum reveals some
738		of its metabolic features. Bmc Genomics 20, 1-18 (2019).
739	72	Belzecki, G., McEwan, N. R., Kowalik, B., Michalowski, T. & Miltko, R. Effect of Entodinium
740		caudatum on starch intake and glycogen formation by Eudiplodinium maggii in the rumen
741		and reticulum. <i>Eur J Protistol</i> <b>57</b> , 38-49 (2017).
742	73	Allen, M. S. Relationship between fermentation acid production in the rumen and the
743		requirement for physically effective fiber. Journal of Dairy Science 80, 1447-1462 (1997).
744	74	Solomon, R. et al. Protozoa populations are ecosystem engineers that shape prokaryotic
745		community structure and function of the rumen microbial ecosystem. ISME J 16, 1187-1197
746		(2022).
747	75	Newbold, C. J., Lassalas, B. & Jouany, J. P. The importance of methanogens associated with
748		ciliate protozoa in ruminal methane production in vitro. Lett Appl Microbiol 21, 230-234
749		(1995).
750	76	Newbold, C. J., de la Fuente, G., Belanche, A., Ramos-Morales, E. & McEwan, N. R. The Role
751		of Ciliate Protozoa in the Rumen. <i>Front Microbiol</i> 6, 1313 (2015).
752	77	Bauman, D. E., Davis, C. L. & Bucholtz, H. F. Propionate Production in Rumen of Cows Fed
753		Either a Control or High-Grain, Low-Fiber Diet. <i>Journal of Dairy Science</i> 54, 1282-& (1971).
754	78	Jiao, H. P. et al. Effect of concentrate feed level on methane emissions from grazing dairy
755		cows. J Dairy Sci <b>97</b> , 7043-7053 (2014).
756	79	Martin, C., Morgavi, D. P. & Doreau, M. Methane mitigation in ruminants: from microbe to
757		the farm scale. <i>Animal</i> <b>4</b> , 351-365 (2010).
758	80	Finlay, B. J. et al. Some Rumen Ciliates Have Endosymbiotic Methanogens. Fems
759		Microbiology Letters <b>117</b> , 157-162 (1994).
760	81	Popova, M. et al. Effect of fibre- and starch-rich finishing diets on methanogenic Archaea
761		diversity and activity in the rumen of feedlot bulls. Animal Feed Science and Technology 166-
762		<b>67</b> , 113-121 (2011).
763	82	Zhang, X. M. et al. Corn oil supplementation enhances hydrogen use for biohydrogenation,
764		inhibits methanogenesis, and alters fermentation pathways and the microbial community in
765		the rumen of goats. <i>Journal of Animal Science</i> <b>97</b> , 4999-5008 (2019).
766	83	Niu, P. et al. A Basic Model to Predict Enteric Methane Emission from Dairy Cows and Its
767		Application to Update Operational Models for the National Inventory in Norway. Animals
768		(Basel) <b>11</b> , 1891 (2021).
769	84	McAllister, T. A., Okine, E. K., Mathison, G. W. & Cheng, K. J. Dietary, environmental and
770		microbiological aspects of methane production in ruminants. Canadian Journal of Animal
771		Science <b>76</b> , 231-243 (1996).
772	85	Van Kessel, J. A. S. & Russell, J. B. The effect of pH on ruminal methanogenesis. FEMS
773		microbiology ecology <b>20</b> , 205-210 (1996).
774	86	Russell, J. B., Muck, R. E. & Weimer, P. J. Quantitative analysis of cellulose degradation and
775		growth of cellulolytic bacteria in the rumen. FEMS Microbiol Ecol 67, 183-197 (2009).
776	87	Russell, J. B. The importance of pH in the regulation of ruminal acetate to propionate ratio
777		and methane production in vitro. J Dairy Sci 81, 3222-3230 (1998).

- Kleen, J. L., Hooijer, G. A., Rehage, J. & Noordhuizen, J. P. Subacute ruminal acidosis (SARA):
  a review. *J Vet Med A Physiol Pathol Clin Med* 50, 406-414 (2003).
- Coleman, G. & Sandford, D. C. The engulfment and digestion of mixed rumen bacteria and
  individual bacterial species by single and mixed species of rumen ciliate protozoa grown in
  vivo. *The Journal of Agricultural Science* 92, 729-742 (1979).
- Park, T. & Yu, Z. Do Ruminal Ciliates Select Their Preys and Prokaryotic Symbionts? *Front Microbiol* 9, 1710 (2018).
- Gutierrez, J. & Davis, R. E. Bacterial Ingestion by the Rumen Ciliates Entodinium and
   Diplodinium. *Journal of Protozoology* 6, 222-226 (1959).
- Perez-Riverol, Y. *et al.* The PRIDE database and related tools and resources in 2019:
  improving support for quantification data. *Nucleic Acids Res* 47, D442-D450 (2019).