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Recovery of metagenome-assembled genomes from the rumen and fecal DATA DESCRIPTOR microbiomes of Bos indicus beef cattle

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Nelore is a Bos indicus beef breed that is well-adapted to tropical environments and constitutes most of the world's largest commercial cattle herd: the Brazilian bovine herd. Despite its significance, microbial genome recovery from ruminant microbiomes has largely excluded representatives from Brazilian Nelore cattle. To address this gap, this study presents a comprehensive dataset of microbial genomes recovered from the rumen and feces of 52 Brazilian Nelore bulls. A total of 1,526 non-redundant metagenome-assembled genomes (MAGs) were recovered from their gastrointestinal tract, with 497 ruminal and 486 fecal classified as high-guality. Phylogenetic analysis revealed that the bacterial MAGs fall into 12 phyla, with Firmicutes and Bacteroidota being the most predominant, while all archaeal MAGs belong to the genus Methanobrevibacter. The exploration of these microbial genomes will provide valuable insights into the metabolic potential and functional roles of individual microorganisms within host-microbiome interactions, contributing to a better understanding of the microbiome's roles in bovine performance.

Background & Summary

The gastrointestinal tract (GIT) of ruminants harbours a vast microbial ecosystem, termed the GIT microbiome, which plays critical roles in the digestive and immune systems of these animals¹. The fermentation accomplished by the GIT microbiome influences production traits such as feed efficiency and methane emission^{2,3}. This association between so many important processes and the GIT microbiome of ruminants indicates that its modulation could be a pivotal strategy to improve animal health and food quality while promoting more efficient and environmentally sustainable animal production systems⁴. But to achieve this, a comprehensive understanding of the composition, functionality, and interactions of the ruminant microbiomes is essential. Therefore, the present study aims to provide a comprehensive dataset that could serve as a foundation for more in-depth analyses on Nelore or ruminant microbiomes.

Despite the numerous advances regarding the study of ruminant microbiomes, there are still some gaps in our knowledge, with microbes whose characterization and role remain undefined or unknown⁵. Although this is strongly related to the inherent difficulties in cultivating certain microbes, the "Hungate1000" project recovered 410 bacterial and archaeal genomes from ruminant microbiomes through a combination of culturing and sequencing⁶. Nonetheless, culture-independent and reference-free approaches such as *de novo* assembly of shotgun metagenomic reads followed by binning into metagenome-assembled genomes (MAGs) have been developed⁷. This approach has significantly expanded the datasets of microbial genomes from diverse environmental niches, including the ruminant microbiomes^{5,7-13}. Among the studies considering beef cattle animals, two stand out for having recovered 4,941 MAGs from the ruminal microbiome of Scottish cattle¹⁰ and 1,200 MAGs from the ruminal microbiome of African (Boran) cattle¹². The successful recovery of these microbial genomes

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Fig. 1 A schematic representation of the workflow applied to this study. Steps 1 and 2 were performed in our previous study³. Step 3 was applied to this study. The Nelore picture was taken by Gisele Rosso in 2023 and it belongs to Embrapa Southeast Livestock Multimedia: Image bank.

represents a significant accomplishment. Nevertheless, it's important to emphasise that the GIT microbiomes and their associated functional potential can significantly differ due to factors such as diet, genetics, and the host animal's environment^{3,5,14,15}. Furthermore, most studies focus on rumen samples, even though significant taxonomic and functional variations are observed in the microbiomes distributed along the GIT^{3,5,15,16}. Consequently, the current collection of microbial genomes obtained from microbiomes so far does not fully represent the diversity of the whole GIT ecosystem of bovines from different geographic locations, climates, and feeding regimes.

Nelore is a *Bos indicus* beef breed adapted to tropical environments and constitutes most of the biggest commercial herd in the world, the Brazilian bovine herd¹⁷. Despite its prominence, microbial genome studies focused on ruminant metagenomes have, until now, overlooked representatives from the Brazilian Nelore breed. In a recent work from our group, we analysed metagenomic data obtained from Nelore rumen and fecal microbiomes and unveiled significant associations between the bulls' microbiomes and their diet and phenotypes³. However, these analyses only included the classification of metagenomic reads, which provides a broad perspective on the taxonomic profile and functional potential of the community, but falls short of exploring the microbiomes with a higher microbial resolution. Such limitations include the inability to assign functions to specific taxa, comprehend strain-specific genomic variations, and identify previously uncharacterized enzymes^{10,15,18}.

To reduce the underrepresentation of genomes from beef cattle microbiomes, we aimed to recover and characterise microbial genomes from the rumen and fecal samples of 52 Brazilian Nelore animals. A schematic diagram of the workflow followed in this study is presented in Fig. 1.

In this study, we single-assembled (assembly of each individual sample) and co-assembled (assembly of all samples from the same type) the metagenomic data from the ruminal content and fecal samples of 52 Brazilian Nelore steers^{3,19}, producing over 60 million contigs totaling 63.9 gigabase pairs (Gbp). The bins obtained from the assemblies were aggregated and de-replicated at an average nucleotide identity (ANI) \geq 99%, resulting in a total of the 1,526 GIT (789 ruminal and 737 fecal) non-redundant MAGs with completeness \geq 50% and contamination \leq 10%. Among these MAGs, 497 ruminal and 486 fecal were classified as high-quality (completeness \geq 80%; contamination \leq 10%; quality score \geq 50) and were used for further analysis, while the remaining were classified as medium-quality (Fig. 2a).

The genome size of the 983 High-Quality (HQ) MAGs ranges from 536 kilobases pairs (Kbp) to 5.8 megabases pairs (Mbp), with the majority falling within the range of 2–3 Mbp for HQ ruminal MAGs and 1.8–2.5 Mbp for HQ fecal MAGs (Fig. 2b). More than half of the HQ MAGs (n = 562) possessed less than





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200 contigs (Fig. 2c). The majority of the HQ MAGs have N50 values ranging from 10 to 50 kb (Fig. 2c). GC content ranges from 0.2 to 0.6 in both ruminal and fecal HQ MAGs (Fig. 2c). Further information on the assemblies, bins, and HQ MAGs metrics can be found in Supplementary Tables 1, 2.

Taxonomic classification of the HQ MAGs revealed that they cover two microbial kingdoms, being 476 ruminal and 474 fecal MAGs assigned as Bacteria, whereas 21 ruminal and 12 fecal MAGs were assigned as Archaea. Complete taxonomic information can be found in Supplementary Table 3. The bacterial MAGs cover 12 known phyla (Fig. 3), mostly belonging to *Firmicutes* (n = 186 in rumen; n = 271 in feces) and *Bacteroidota* (n = 220 in rumen; n = 141 in feces). Among the *Firmicutes*, the majority belong to the class *Clostridia* (n = 153 in rumen; n = 227 in feces), followed by the classes *Negativicutes* (n = 10 in rumen; n = 26 in feces) and *Bacteroidota* (n = 23 in rumen; n = 18 in feces). Among the *Bacteroidota*, all MAGs belong to the class *Bacteroidia* and the order *Bacteroidales* (n = 220 in rumen; n = 141 in feces). Considering the MAGs classified as archaeal, all belong to the genus *Methanobrevibacter* (n = 21 in rumen; n = 12 in feces) (Fig. 4).

A predominance of MAGs assigned as *Firmicutes* and *Bacteroidota* was expected, as these are the most abundant phyla observed in the microbiomes of the animals studied³ as well as other ruminants^{1,6,15}. Notably, taxa from these phyla have been associated with various factors of interest in animal production such as methane emission and feed efficiency^{2,3,20}.

Similarly, a predominance of the genus *Methanobrevibacter* was expected since this is the most dominant archaeal genus within the microbiomes of ruminants^{2,10}. *Methanobrevibacter* is a hydrogenotrophic methanogen, capable of using H_2 to reduce CO_2 into methane through the hydrogenotrophic pathway, the primary via of methane production in the rumen⁴.

Each of the 497 HQ ruminal MAGs had a taxonomic family assigned to it, consisting of 52 bacterial families and 1 archaeal family. 495 were classified to the genus level and 317 assigned to the species level. Regarding HQ fecal MAGs, all the 486 were classified up to the family level (46 bacterial families and 1 archaeal family). Of these, 470 were assigned to a genus and 215 were classified to the species level.



Fig. 3 Phylogenetic tree illustrating the relationships among the 950 bacterial MAGs derived from Nelore's microbiomes. The tree was produced with GTDBtk³⁰ and subsequently drawn using GraPhlAn³¹. Labels denote the assigned phylum for MAGs within each clade.

Notably, a fraction of these HQ MAGs was not assigned to a species (n = 180 in rumen and n = 271 in feces), while a smaller subset lacked both genus and species assignation (n = 2 in rumen and n = 16 in feces). This indicates a shortage of representatives for certain microbial groups and highlights the significance of studies aiming to recover genomes from microbiomes. Focused analyses should be conducted to explore the evolutionary relationships of these MAGs lacking complete taxonomy assignment.

Our study resulted in a comprehensive dataset of microbial genomes from the rumen and feces of Brazilian Nelore bulls. To the best of the authors' knowledge, this marks the pioneering recovery of MAGs from this *Bos indicus* beef breed. The exploration of these microbial genomes will provide deep insights into the diverse roles of the microbiomes in methane emission, water footprint, feed efficiency, disease prevention, and overall bovine performance.

Methods

Metagenomic data. We processed and analysed ruminal and fecal metagenomes from 52 Nelore steers (*Bos indicus*), which comprises ~5.2 billion high-quality Illumina sequences (after the steps of trimming and filtering, and mapping against the host genome)¹⁹. The metagenomic data used in this study were previously published by our group³ and can be found under the BioProject ID PRJNA987743¹⁹. Briefly, total DNA was extracted from rumen content samples and fecal samples using the Quick-DNA[™] Fecal/Soil Microbe Miniprep Kit (ZYMO Research Corp., Irvine, CA), metagenomic libraries were constructed with the Illumina DNA Prep Kit and sequenced on an Illumina NextSeq sequencer platform (ESALQ Genomics Center, Piracicaba, SP, Brazil) using the NextSeq P3 flowcell 300 cycles (Illumina). More information can be found in our previous study³, and in Supplementary Table 1.

The handling of the animals was conducted at the feedlot facility of "Embrapa Pecuária Sudeste" following Brazilian guidelines on animal welfare and approved by the Ethics Committee on the Use of Animals, College of Veterinary and Animal Science, São Paulo State University under protocol nº 8510190118 and EMBRAPA Livestock Science Ethics Committee on Animal Experimentation, São Carlos, São Paulo (Protocol No. 09/2016).



Fig. 4 Phylogenetic tree illustrating the relationships among the 33 archaeal MAGs derived from Nelore's microbiomes and closely related genomes. *Methanosphaera* sequences were used as outgroup. The tree was produced with GTDBtk³⁰ and subsequently drawn using the ggtree³² package. All archaeal MAGs were assigned as *Methanobrevibacter* genus.

Metagenomic assembly, binning and MAGs recovery. The high-quality metagenomic sequences of each sample were individually assembled (single-assembled) and high-quality metagenomic sequences from all samples of the same sample type (rumen or feces) were co-assembled. The assemblies were performed with MEGAHIT v1.2.9²¹ with options '-kmin-1pass-k-list 27,37,47,57,67,77,87-min-contig-len 1000'. Contigs from both single-metagenome assemblies and co-assemblies were grouped into draft genomes (bins) using three bin-

ning tools: MetaBAT2 v.2.15²² with option '-minContigLength 2000', CONCOCT v.1.0.0²³ and MaxBin2 v.2.2.7²⁴, the later two with default parameters. The depth of coverage of each contig considered by the binning tools was calculated by mapping the raw reads back to their assemblies using BWA MEM v.0.7.17²⁵ with default parameters, converting the mapping file to BAM format using Samtools v.1.13²⁶. The contigs' coverage was calculated using the script '*jgi_summarize_bam_contig_depths*' for MetaBAT2 and MaxBin2 runs, and the script '*concoct_coverage_table.py*' for CONCOCT run. The bins generated by these tools were integrated using the DAS tool²⁷ with options '-l concoct,maxbin,metabat-search_engine diamond-write_bin_evals-write_bins'.

The bins were aggregated according to the sample type (rumen or feces) and then de-replicated using dRep v.3.2.2²⁸ with options 'dereplicate -p 32 -comp 50 -con 10 -pa 0.95 -sa 0.99', obtaining a set of 789 and 737 ruminal and fecal MAGs, respectively. In this process, only bins assessed by CheckM v1.1.3²⁹ as having medium quality (completeness \geq 50% and contamination \leq 10%) were considered for the de-replication workflow. After de-replication, the MAGs were filtered for completeness \geq 80%, contamination \leq 10% and quality score \geq 50. Quality scores were defined as completeness $-5 \times$ contamination, which only allows higher levels of contamination when the genome is predominantly complete⁸. This way, a total of 497 and 486 ruminal and fecal high-quality MAGs, respectively, were obtained and used for further analysis.

Taxonomic classification of the MAGs. To assign a taxonomy to each HQ MAG, GTDB-tk v2.3.2 was used with the GTDB database release 207 and options 'classify_wf-full_tree-skip_ani_screen'. GTDB-tk generated separate phylogenetic trees for bacteria and archaea with the 983 HQ MAGs recovered and more than 60,000 genomes from the GTDB database. Taxonomy assignment of each MAG was based on its placement in the tree and its average nucleotide identity (ANI) to reference genomes. When rank assignments were considered ambiguous, the relative evolutionary divergence (RED) was used³⁰. For better visualisation, a bacterial tree

containing only the 950 bacterial MAGs was generated using GTDB-tk with option 'infer' and the sequence alignment previously generated by GTDB-tk. For the archaeal tree, the closest reference genomes to the archaeal MAGs were considered for the tree as well as *Methanosphaera* sequences, which were used as outgroup. GraPhlAn (Graphical Phylogenetic Analysis) v.1.1.4³¹ was used to generate the figure of the tree with bacterial MAGs, and R package *ggtree*³² was used to generate the figure of the tree with archaeal MAGs.

For the submission of the high-quality MAGs to the National Center for Biotechnology Information (NCBI), the lowest taxonomic ranks assigned by GTDB for each MAG were retained if they were present in the NCBI taxonomy database; otherwise, they were replaced with the most appropriate taxonomic name recommended by NCBI. The best names tax names recommended by NCBI, NCBI Accession and links of each high-quality MAG are in Supplementary Table 3.

Mean coverage of the MAGs. Metagenomic reads from each sample were mapped to each MAG using Bowtie2 v2.5.3³³ with option '-no-unal'. SAMtools v1.19.2³⁴ was used to generate sorted BAM files with default parameters. Depth of coverage (mean) based on the sorted bam files generated with SAMtools was calculated using CoverM v0.7.0 (https://github.com/wwood/CoverM) with options 'genome -m mean -m mean -min-read-aligned-percent 0.75 -min-read-percent-identity 0.95 -min-covered-fraction 0'.

Data Records

Raw reads used in this study¹⁹ are available at the National Center for Biotechnology Information (NCBI) under the BioProject Number PRJNA987743. The 983 high-quality Nelore MAGs generated in this study have been deposited in the same BioProject Number PRJNA987743³⁵. Accession links for each high-quality MAG can be found in Supplementary Table 3.

Technical Validation

The metagenomic reads used in this study went through multiple steps of rigorous quality control, which included removing low-quality reads, adapters and host-associated sequences. These steps were performed using Trimmomatic and Bowtie2 as described in our previous study³. After assembly, only contigs greater than 1 Kbp were considered, as small contigs tend to carry less compositional signatures, which can bias the binning step. The quality of the recovered MAGs was assessed using CheckM and only those with completeness $\geq 80\%$, contamination $\leq 10\%$ and quality score ≥ 50 were used in the downstream analyses. These metrics are similar to those used in previous studies focused on recovering MAGs from beef cattle microbiomes^{10,12,15}.

Code availability

The present study did not use custom scripts to generate the dataset. The parameters and versions of all the bioinformatics tools used for the analysis are described in the Methods section. The code used to run each of the tools is publicly available at Github (https://github.com/lconteville/Nelore_MAGs).

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Author contributions

L.C.C.: Conceptualization, Formal Analysis, Methodology, Writing – original draft, Investigation, Validation, Visualization. J.V.S.: Writing – original draft, Investigation. B.G.N.A.: Conceptualization, Writing – review & editing, Investigation. L.L.C.: Supervision, Writing – review & editing, Funding acquisition, Project administration. J.C.P.P.: animal experiment design and execution, Supervision, Writing – review & editing, Data curation. L.C.A.R.: Conceptualization, Funding acquisition, Project administration, Resources, Supervision, Writing – review & editing. All authors reviewed and approved the manuscript.

Competing interests

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

Additional information

Supplementary information The online version contains supplementary material available at https://doi.org/ 10.1038/s41597-024-04271-3.

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