In silico Screening Unveil the Great Potential of Ruminal Bacteria Synthesizing Lasso Peptides

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Studies of rumen microbial ecology suggest that the capacity to produce antimicrobial peptides could be a useful trait in species competing for ecological niches in the ruminal ecosystem. However, little is known about the synthesis of lasso peptides by ruminal microorganisms. Here we analyzed the distribution and diversity of lasso peptide gene clusters in 425 bacterial genomes from the rumen ecosystem. Genome mining was performed using antiSMASH 5, BAGEL4, and a database of well-known precursor sequences. The genomic context of the biosynthetic clusters was investigated to identify putative lasA genes and protein sequences from enzymes of the biosynthetic machinery were evaluated to identify conserved motifs. Metatranscriptome analysis evaluated the expression of the biosynthetic genes in the rumen microbiome. Several incomplete (n = 23) and complete (n = 11) putative lasso peptide clusters were detected in the genomes of ruminal bacteria. The complete gene clusters were exclusively found within the phylum Firmicutes, mainly (48%) in strains of the genus Butyrivibrio. The analysis of the genetic organization of complete putative lasso peptide clusters revealed the presence of co-occurring genes, including kinases (85%), transcriptional regulators (49%), and glycosyltransferases (36%). Moreover, a conserved pattern of cluster organization was detected between strains of the same genus/species. The maturation enzymes LasB, LasC, and LasD showed regions highly conserved, including the presence of a transglutaminase core in LasB, an asparagine synthetase domain in LasC, and an ABC-type transporter system in LasD. Phylogenetic trees of the essential biosynthetic proteins revealed that sequences split into monophyletic groups according to their shared single common ancestor. Metatranscriptome analyses indicated the expression of the lasso peptides biosynthetic genes within the active rumen microbiota. Overall, our in silico screening allowed the discovery of novel biosynthetic gene clusters in the genomes of ruminal bacteria and revealed several strains with the genetic potential to synthesize lasso peptides, suggesting that the ruminal microbiota represents a potential source of these promising peptides.

Keywords: precursor sequence, RiPPs, rumen, Butyrivibrio, antiSMASH 5, BAGEL4
INTRODUCTION

Natural products have improved human quality of life and play a noteworthy role in drug discovery and development (Newman and Cragg, 2016). Among natural products, secondary metabolites stand out as scaffolds for the development of products for human medicine, animal health, crop protection, and numerous biotechnological applications (Bachmann et al., 2014). Traditional culture-based strategies for the screening of new molecules have been responsible for the discovery of many relevant enzymes and metabolites (Steele and Stowers, 1991; Winter et al., 2011). However, these approaches are largely driven by chance, making them costly, time-consuming, and often limited regarding the number of strains that can be used in large-scale screening endeavors (Tietz et al., 2017). The advent of microbial genomics and the increasing availability of computational tools to perform genome mining has evidenced the underexplored potential of some microbial species as alternative sources of new therapeutic agents (Winter et al., 2011). These tools and resources emerged as an alternative approach to identify novel biosynthetic gene clusters (BGCs) encoding putative bioactive metabolites and to assess the genetic potential of producer strains (Weber and Kim, 2016). Besides the discovery of new products, genome mining also contributes to understanding the connection between metabolites and the gene sequences that encode them, providing ecological insights about the role of individual microbial populations in the microbiome (Bachmann et al., 2014).

Secondary metabolites could play a diverse role in the environment by their wide range of biological activities. In this context, lasso peptides stand out as functionally diverse metabolites produced by several species of bacteria. Members of the lasso peptide family are reported to have antimicrobial (Salomon and Farias, 1992; Kuznedelov et al., 2011) and anti-viral activities (Frechet et al., 1994; Constantine et al., 1995). These molecules also can show receptor antagonistic activities such as the glucagon receptor antagonist BI-32169 (Potterat et al., 2004; Knappe et al., 2010) or act as enzyme inhibitors (Katahira et al., 1996; Yano et al., 1996). This functional diversity combined with their unusual topology, which resembles a class of ribosomally synthesized and post-translationally modified peptides (RIPPs), which are suitable scaffolds for drug development (Knappe et al., 2011). Moreover, these molecules compose a class of ribosomally synthesized and post-translationally modified peptides (RIPPs), which are suitable for genome mining approaches due to the gene-encoded nature of their precursors (Maksimov and Link, 2014).

The lasso peptides typically contain 16–21 amino acid residues and are defined by their unusual topology, which resembles threaded lassos or slipknots. This peculiar structure is the result of cyclization, which is due to the amide bond between the amino group of an N-terminal Gly/Cys residue and the carboxyl group of the Glu/Asp residue at position 8 or 9 of the mature peptide (Bayro et al., 2003; Rosengren et al., 2003; Maksimov et al., 2012a). This post-translational modification is performed by a protease that shows homology to bacterial transglutaminases (LasB) and by a protein homologous to asparagine synthetase (LasC) (Duquesne et al., 2007a; Severinov et al., 2007). It is assumed that LasC is involved in the activation of the side-chain carboxyl group of the Glu/Asp residue at position 8 or 9, while LasB catalyzes the transfer of ammonia from glutamine to the activated side-chain carboxyl group. Following this, the cleavage of the precursor peptide releases an N-terminal Gly/Cys, and the cyclization takes place by a nucleophilic attack (Larsen et al., 1999; Makarova et al., 1999; Duquesne et al., 2007a; Yan et al., 2012). The gene D is also frequently found on the biosynthetic gene clusters of lasso peptides encoding an ABC transporter that is thought to play a role in immunity of producer cells against the antimicrobial activity of their lasso peptides (Solbiati et al., 1996, 1999; Bountra et al., 2017).

Studies based on genome mining have contributed to identifying new microbial species producing lasso peptides (Knappe et al., 2008; Maksimov et al., 2012b; Tietz et al., 2017). The ruminal ecosystem is composed of microbial communities that show high taxonomic and functional diversity (Morais and Mizrahi, 2019), and although it has been investigated as a source for novel enzymes and antimicrobials (Oyama et al., 2017; Neumann and Suen, 2018; Palevich et al., 2019), the rumen still represents an underexplored environment for the discovery of lasso peptides. Indeed, both culture-dependent and culture-independent approaches have revealed promising antimicrobial peptides from the rumen (Mantovani et al., 2002; Russell and Mantovani, 2002; Azevedo et al., 2015; Oyama et al., 2017, 2019). However, no systematic efforts have been made to investigate the potential of rumen bacteria to produce lasso peptides. The availability of hundreds of reference genomes from cultured ruminal bacteria through the Hungate1000 Project⁴, offers an unprecedented opportunity to identify novel lasso peptides within the genomes of ruminal bacteria. The present study set out to perform an in silico screening of the genomes of the major bacterial species represented in the core ruminal microbiome in an attempt to identify biosynthetic gene clusters encoding putative lasso peptides. As such, this work aimed to i) characterize the distribution of BGCs potentially associated with the production of lasso peptides in the genomes of ruminal bacteria; ii) identify sequences of potential novel lasso peptide precursors, iii) evaluate the phylogenetic distribution and conservation of the biosynthetic genes/proteins predicted to encode lasso peptides, and iv) examine if these biosynthetic genes are expressed by the active rumen microbiota.

MATERIALS AND METHODS

Genomic Data Collection and Prediction of Lasso Peptides Within Rumen Bacterial Genomes

Genome files (.fasta) of 425 ruminal bacteria belonging to the Hungate1000 project (Seshadri et al., 2018) were downloaded from the NCBI (National Center for Biotechnology Information⁵ and JGI (Joint Genome Institute⁶) websites (Supplementary Table 1).
To identify microcin producers, the amino acid sequences of McjA (AAD28494.1), McjB (AAD28495.1), McjC (AAC14226.1), and McjD (AAC14214.1), which are products of the mcjABCD gene cluster, were downloaded from NCBI. A set of 68 lasso peptides previously described in the literature were also screened based on their core sequences (Zyubko et al., 2019) (Supplementary Table 2). Screening of these protein-coding genes in genomes of ruminal bacteria was performed by running BLASTx through the command line. The cut-off parameters used to consider positive hits were a minimum sequence identity of 30% and E-value $< 10^{-5}$. New putative biosynthetic gene clusters in the genomes of ruminal bacteria were predicted using the web-based genome mining tools of antiSMASH 5 (Blin et al., 2019) and BAGEL4 (van Heel et al., 2018).

The genes belonging to predicted clusters were generically named lasA, lasB, lasC, and lasD, corresponding to the following putative gene products: LasA, the lasso peptide precursor; LasB, the leader peptidase, LasC, the lasso cyclase and LasD, the ABC transporter (Arnison et al., 2013).

Distribution of BGCs Encoding Putative Lasso Peptides in the Genomes of Ruminal Bacteria

To verify the distribution of biosynthetic gene clusters encoding putative lasso peptides in the genomes of ruminal bacteria, a phylogenetic tree was reconstructed using the 16S rRNA gene sequences from the rumen bacterial genomes analyzed in this study. The sequences were obtained from the Hungate1000 Project and aligned using RDP Release 11.5 aligner of the Ribosomal Database Project website (RDP). The phylogenetic tree was reconstructed using the Approximately Maximum-Likelihood method by FastTree v2.1 (Price et al., 2010). The Interactive Tree of Life (iTOL) interface v4 (Letunic and Bork, 2019) was used to visualize and annotate the FastTree output file (.tree).

Genomic Context of the Lasso Peptide Biosynthetic Gene Clusters

When a putative biosynthetic gene cluster was predicted by BAGEL4 and/or antiSMASH 5 but the gene encoding the potential precursor peptide was not identified, the regions located upstream and downstream of the predicted biosynthetic genes were examined, covering a region varying from 4762 bp to 17083 bp in length. This analysis is based on the assumption that genes sharing similar occurrence patterns or located near each other within the genome are likely to be functionally related. For that, genomes were annotated using Prokka v1.12 (Seemann, 2014) (minimum contig size of 200 kb and E-value $< 10^{-6}$) through the Galaxy platform and manually inspected to identify sequences potentially encoding the lasso peptide precursor within the genomic context of the biosynthetic machinery minimally required for the production of lasso peptides. A manual analysis of the genes adjacent to the lasso peptide gene cluster was also performed to investigate the presence of co-occurring genes. When proteins were annotated as "hypothetical", BLAST analyses were performed in Uniprot to investigate the protein function using 30% of amino acid sequence similarity as the cut-off parameter.

Characterization of the Biosynthetic Proteins

Conservation Analysis of LasA, LasB, and LasC

Conserved motifs in putative lasso peptide precursors (LasA) and maturation enzymes (LasB, and LasC) were identified using the Batch Web CD-Search tool (Lu et al., 2020). Default parameters were used for the analysis and the results were filtered considering E-value $< 10^{-6}$. To analyze if the amino acid sequences of the biosynthetic precursors/proteins (LasA, LasB, and LasC) could be grouped according to the evolutionary history of the major species of bacteria from the rumen microbiome, phylogenetic trees were reconstructed based on the sequences of these proteins. The sequences were aligned using muscle 3.8.31. FastTree v2.1 was used to perform the tree reconstruction and iTOL was used to visualize and annotate the tree as described above. For LasA, the amino acid composition of conserved residues corresponding to the 44 amino acid residues located in the N-terminus of the protein was represented using WebLogo 2.8.2 and the default parameters.

Prediction of the LasA Core

Predictions of putative LasA core sequences followed patterns of the distribution of amino acid residues that have been extensively reported in the literature for precursor and mature lasso peptide sequences (Jia Pan et al., 2012; Maksimov et al., 2012a,b; Tietz et al., 2017). The core sequences of the putative lasso peptide precursors were inferred using BAGEL4, antiSMASH 5, and manual analyses of the genomic sequences flanking the putative gene clusters. The presence of glycine (G) at position 1 of the core peptide, followed by an aspartate (D) located at position 8 or 9 were used as criteria indicative of the N-terminal macrolactam ring matching the lasso peptides precursor pattern. The presence of threonine (T) in the leader peptide near the cleavage site was also taken into account, as well as the presence of conserved amino acids at particular positions in the precursor peptides, as indicated by the alignment of putative LasA sequences. All sequences predicted as a putative core of LasA were run through RiPPMiner$^7$ to confirm cross-links between post-translationally modified residues associated with the formation of a characteristic ring structure in lasso peptides (Agrawal et al., 2017).

Expression of Lasso Peptide Genes in Rumen Metatranscriptomes

The expression of the genes lasA, lasB, and lasC predicted in the genomes of ruminal bacteria were investigated using different metatranscriptome datasets from the rumen. Sequences

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$^6$https://weblogo.berkeley.edu/logo.cgi

$^7$http://www.nii.ac.in/~priyesh/lantipepDB/new_predictions/index.php#/~priyesh/lantipepDB/new_predictions/cyclizationPrediction.php
of fifteen metatranscriptomes were obtained from the sequence read archive (SRA) of NCBI⁴ (Leinonen et al., 2011). These datasets included ruminal metatranscriptomes from dairy and beef cattle and sheep, as described in Supplementary Table 3.

To evaluate the expression of unique lasA, lasB, and lasC genes, sequences corresponding to these genes but showing more than 50% similarities in a distance matrix calculated using Clustal Omega (Sievers et al., 2011) were eliminated from the downstream analyses. Bowtie-build tool was then used to index the lasso peptide sequences and Bowtie2/2.2.8 (Langmead and Salzberg, 2012) was applied to align the genes and the metatranscriptome datasets. The alignment results were visualized through Tablet software 1.19.09.03 (Milne et al., 2012). The expression levels of lasA, lasB, and lasC were normalized calculating the number of reads per kilobase per million of mapped reads (RPKM) (Mortazavi et al., 2008).

RESULTS

Distribution of Predicted Biosynthetic Gene Clusters of Lasso Peptides in the Species of Ruminal Bacteria

In the current study, we performed data mining in 425 bacterial genomes representing the major species of bacteria from the rumen microbiome in an attempt to identify BGCs potentially associated with the production of lasso peptides. Computational tools were applied to search for sequences in the rumen bacterial genomes with similarities to genes that are known to be associated with the biosynthesis of lasso peptides. *Butyrivibrio proteoclasticus* P18 and *Lachnospiraceae bacterium* NK4A144 harbored a gene encoding a product matching the McjC protein previously characterized in the mcjABCD operon (30% as a sequence similarity cut-off and E-value < 10⁻⁵), which is associated with the production of microcin J25. Moreover, mining the rumen bacterial genomes using the core regions of 68 lasso peptide precursors as query sequences revealed that *Actinomyces denticolens* PA and *Bacillus cereus* KPR-7A harbor sequences of core peptides highly similar (>70%) to Ssv-2083 and Paeninodim, respectively.

The BGCs predicted using BAGEL4 and antiSMASH 5 were divided into complete clusters, when containing all the genes considered to be essential (lasA, lasB and lasC) for the biosynthesis machinery required for lasso peptide production, and those which appear to be incomplete gene clusters, containing at least one (but not all) of the genes required for lasso peptide biosynthesis. The genome mining approaches revealed thirty-four ruminal bacterial genomes harboring incomplete or complete biosynthetic gene clusters potentially encoding putative lasso peptides (Table 1). The genomes with positive hits belonged mainly to the genera *Butyrivibrio*, of which 14 incomplete clusters and 3 complete clusters were identified out of 53 genomes analyzed. Members of the genus *Lachnospira* sp. (n = 5) harbored 3 incomplete and 2 complete biosynthetic gene clusters. Biosynthetic clusters containing all the essential genes for lasso peptide biosynthesis were also identified in the genomes of ruminal *Bacillus* sp. (n = 3), while other genera of ruminal bacteria, such as *Actetomaculum*, *Actinomyces*, *Clostridium*, *Eubacterium*, and *Ruminococcus* presented clusters in lower abundance or the number of available genomes was too few to allow inferences about the abundance of putative lasso peptide gene clusters (Supplementary Figure S1).

The number of genes and biosynthetic clusters that were predicted in the ruminal bacterial genomes varied according to the computational tool used to screen for the lasso peptides (Figure 1). In total, BAGEL4 predicted putative lasso peptide biosynthetic gene clusters in 109 ruminal bacterial genomes. However, the majority of these genomes (75%) harbored only putative additional genes and genes with no predicted function. These additional genes were identified by BAGEL4 as encoding modification proteins such as GlyS, a glycosyltransferase; regulatory proteins such as LanK, a sensor histidine kinase, and LanR, a transcriptional regulator; immunity/transport proteins such as ABC transporter and transport/leader cleavage proteins as LanT. BAGEL4 also predicted putative coding regions showing similarity to the ReB90 clusters, including kinases and acetyltransferases, in addition to genes with no predicted function (Figure 1). The genes required for lasso peptide production were identified in 27 rumen bacterial genomes using BAGEL4, however, only incomplete gene clusters were detected using BAGEL4 as no lasB gene was identified within these genomes using this computational tool (Table 1). Predictions of BGCs using antiSMASH 5 indicated gene clusters likely to encode lasso peptides in 33 ruminal bacterial genomes with all harboring at least lasA, lasB, or lasC. In 27 (82%) of these genomes, the gene lasD was also detected. These in silico screening approaches combined identified complete lasso peptide gene clusters in 11 rumen bacterial genomes, of which three were harbored by members of the genera *Bacillus, Butyrivibrio* and *Lachnospira*, and two in strains of the genus *Ruminococcus* (Table 1). These results show a higher prevalence and diversity of lasso peptides gene clusters within the *Firmicutes* phylum, mainly among members of the *Lachnospiraceae* family (Figure 1).

Identification of Lasso Peptide Precursors in the Genomic Regions Surrounding the Biosynthetic Gene Clusters

BAGEL4 and/or antiSMASH 5 were effective to predict coding sequences homologous to the enzymes of the lasso peptide maturation pathway (LasB and LasC). However, the prediction of precursor sequences (LasA) was limited using these computational tools due to the inherent features of these peptides, such as their short length and sequence variability. We therefore investigated the genomic context of the gene clusters aiming to identify potential coding sequences containing the expected features of a lasso peptide precursor. This pattern-based search for novel lasso peptide precursors increased the number of rumen bacterial genomes harboring complete gene clusters to 33, including *Acetitomaculum ruminis* DSM 5522, *Eubacterium*...
cellulosolvens LD2006, two species of Clostridium, two species of Lachnospira, three strains of Lachnospiraceae bacterium and 13 strains of Butyrivibrio.

The genomes of Butyrivibrio sp. NC3005, Butyrivibrio sp. YAB3001, Lachnospira multipartita LB2003, Lachnospira pectinoschiza M83, and Lachnospiraceae bacterium YSD2013 showed more than one sequence with homology to the lasA gene and careful examination of all 33 rumen bacterial genomes also indicated distinct sequences in the putative biosynthetic clusters that were likely to encode a lasso peptide precursor in Butyrivibrio sp. AB2020. Additionally, different lasA sequences were predicted in the genome of Ruminococcus flavefaciens 19208 by BAGEL4 and antiSMASH 5. The putative LasA proteins predicted for all the rumen bacterial genomes harboring complete lasso peptides gene cluster are reported in Supplementary Table 4.

Expanding the genomic context analysis beyond the identification of lasA indicated that these biosynthetic clusters have a conserved pattern of genetic organization among groups of phylogenetically related organisms (Figure 2). Alignment of the lasso peptide gene clusters found in Butyrivibrio fibrisolvens indicated that these clusters contain additional genes such as nucleotidyltransferase, HPr kinase/phosphorylase, glycosyltransferase family 2 and EpsH, the sensor histidine kinase ResE and the transcriptional regulatory protein WalR. Other strains of Butyrivibrio sp. and Butyrivibrio proteoclasticus showed clusters containing the sensor protein kinase WalK, the transcriptional regulator SrrA, and the HPr kinase/phosphorylase, in addition to the essential biosynthetic genes. The lasso peptide gene cluster in strains of Lachnospira shared the serine kinase of the HPr protein and the sensor

### Table 1: Ruminal bacterial genomes harboring genes and gene clusters encoding putative lasso peptides predicted by BAGEL4 and antiSMASH 5.

| Genomes                        | BAGEL4 |        |        |        | antiSMASH 5 |        |        |        |
|-------------------------------|--------|--------|--------|--------|-------------|--------|--------|--------|
|                               | lasA   | lasB   | lasC   | lasD   | lasA        | lasB   | lasC   | lasD   |
| Acetitomaculum ruminis DSM 5522| 0      | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Actinomyces denticolens PA    | 1      | 0      | 1      | 1      | 0           | 0      | 0      | 0      |
| Bacillus cereus KPR-7A        | 0      | 0      | 0      | 0      | 1           | 1      | 1      | 1      |
| Bacillus licheniformis VTM3R78| 0      | 0      | 1      | 1      | 1           | 1      | 1      | 1      |
| Bacillus sp. MB2021           | 0      | 0      | 1      | 1      | 1           | 1      | 1      | 1      |
| Butyrivibrio fibrisolvens AB2020| 1     | 0      | 1      | 0      | 0           | 1      | 1      | 1      |
| Butyrivibrio fibrisolvens AR40| 0      | 0      | 1      | 0      | 0           | 1      | 1      | 1      |
| Butyrivibrio fibrisolvens DSM 3071| 0 | 0      | 1      | 0      | 1           | 1      | 1      | 1      |
| Butyrivibrio fibrisolvens MD2001| 0      | 0      | 0      | 1      | 0           | 1      | 1      | 1      |
| Butyrivibrio fibrisolvens WTE3004| 0    | 0      | 1      | 0      | 0           | 1      | 1      | 1      |
| Butyrivibrio fibrisolvens YRB2005| 0     | 0      | 1      | 0      | 0           | 1      | 1      | 1      |
| Butyrivibrio proteoclasticus B316| 0    | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Butyrivibrio proteoclasticus FD2007| 0    | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Butyrivibrio sp. FC2001       | 0      | 0      | 1      | 0      | 0           | 1      | 1      | 1      |
| Butyrivibrio sp. LNla14       | 0      | 0      | 0      | 0      | 0           | 1      | 1      | 1      |
| Butyrivibrio sp. MC2021       | 0      | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Butyrivibrio sp. NC3005       | 0      | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Butyrivibrio sp. VCD2006      | 0      | 0      | 1      | 1      | 1           | 1      | 1      | 1      |
| Butyrivibrio sp. XBB1001      | 0      | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Butyrivibrio sp. XPD2006      | 0      | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Butyrivibrio sp. YAB3001      | 0      | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Clostridium beijerinckii HUN142| 0     | 0      | 1      | 0      | 0           | 1      | 1      | 1      |
| Clostridium butyricum AGR2140| 0      | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Clostridium pectinoschiza M83 | 0      | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Lachnospira cellulosolvens LD2006| 0 | 0      | 1      | 1      | 1           | 1      | 1      | 1      |
| Lachnospira mulitpara D15d    | 0      | 0      | 1      | 1      | 1           | 1      | 1      | 1      |
| Lachnospira multpara LB2003   | 0      | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Lachnospira multpara MC2003   | 0      | 0      | 1      | 1      | 1           | 1      | 1      | 1      |
| Lachnospira multpara ATCC 19207| 0     | 0      | 0      | 0      | 1           | 1      | 1      | 1      |
| Lachnospira pectinoschiza M83 | 0      | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Lachnospiraceae bacterium KH1P17| 0   | 0      | 0      | 0      | 0           | 1      | 1      | 0      |
| Lachnospiraceae bacterium MA2020| 0     | 0      | 1      | 1      | 0           | 1      | 1      | 1      |
| Lachnospiraceae bacterium YSD2013| 0    | 0      | 1      | 0      | 0           | 1      | 1      | 0      |
| Ruminococcus albus 8          | 0      | 0      | 0      | 0      | 1           | 1      | 1      | 1      |
| Ruminococcus flavefaciens ATCC 19208| 1 | 0      | 0      | 1      | 1           | 1      | 1      | 1      |

1 Genomes in bold harbored all the essential biosynthetic genes (lasA, lasB, and lasC) required for lasso peptide production detected by using either BAGEL4 or antiSMASH 5. Number 1 represents the presence of a gene while “0” represents the absence of a gene.
histidine kinase WalK, besides the putative genes encoding LasA, LasB, LasC, and LasD proteins.

Among the species of ruminal bacteria, the HPr kinase/phosphorylase, coenzyme PQQ synthesis protein D (PqqD), and an uncharacterized nucleotidyltransferase were found in approximately 58%, 46% and 30% of the genomes analyzed in this study, respectively (Supplementary Figure 2). Moreover, different proteins showing similar functional annotations were found within the lasso peptide gene clusters among these bacterial genomes, including the sensory proteins ResE and WalK, serine kinases, transcriptional regulators (WalR and SrrA) and glycosyltransferases (EpsH) (Supplementary Figure 2).

**Sequence Conservation Analysis of the Putative Lasso Peptide Proteins LasA, LasB, and LasC**

Analysis of conserved elements in the lasso peptide biosynthesis machinery included LasA-like precursor peptides and proteins homologous to the lasso peptide maturation enzymes (LasB, LasC, and LasD). No conserved motifs were identified in the putative LasA amino acid sequences predicted in the genomes of ruminal bacteria analyzed in this study, indicating that these residues are hypervariable and therefore, subjected to neutral drift. However, genome mining enabled the identification of conserved motifs in homologs of the lasso peptide maturation enzymes LasB, LasC, and LasD, with variable frequency (Table 2). Two conserved motifs were identified in the LasB homologs, including a transglut_core3 motif of the transglutaminase-like superfamily, which is involved in the formation of lasso peptide amide crosslink and was found in 97% of the analyzed LasB proteins. Also, a MdlB motif of an ATPase and permease component of the ABC-type multidrug transport system was detected in the LasB homolog found in the genomes of Ruminococcus albus 8 and Ruminococcus flavefaciens ATCC 19208. In these genomes, the lasB gene appears to be fused with another gene encoding a transporter protein. The MdlB motif was also found in 87% of the LasD homologs predicted in the genomes of ruminal bacteria analyzed in this study, together
FIGURE 2 | Schematic representation of the putative lasso peptide gene clusters and their conserved genomic context in strains of Butyrivibrio [Panels (A) and (B)] and Lachnospira [Panel (C)]. Two groups of putative lasso peptide gene clusters are observed in Butyrivibrio: Panel (A) shows the larger biosynthetic cluster, identified in Butyrivibrio fibrisolvens, while Panel (B) shows the genetic organization of the conserved lasso peptide clusters in the genomes of Butyrivibrio proteoclasticus and unclassified Butyrivibrio strains. When the biosynthetic cluster was identified in the reverse DNA strand, the alignment blocks are shown in the opposite direction. The genomic regions containing the biosynthetic gene clusters were aligned using Mauve version 20150226 and the representation of the genomic context was generated using SnapGene 5.0.8.
with five other domains of different ABC-type transporters occurring at much lower abundances. Six motifs were found in the LasC homologs, most of which belong to a conserved protein domain family (asn_synth_AEB superfamily) of the glutamine-hydrolyzing asparagine synthases.

Phylogenetic analysis of the predicted LasA precursor peptides grouped the sequences in three phylogroups each consisting of a different number of nodes (Figure 3A). The precursor peptides predicted in the genomes of most Butyrivibrio strains and all members of the genus Lachnospira analyzed in this study could be separated into three main distinct coherent clades. Sequences of lasso peptide precursors in the genomes of the genus Ruminococcus also generated a smaller and consistent phylogroup, while other sequences were spread throughout the phylogenetic tree. Although the overall amino acid sequence conservation was relatively low, residues located at positions 20–45 and 60–70 in the putative precursor peptides appeared with higher frequencies compared to other regions of the peptide (Figure 3A). As shown for the genomes of Butyrivibrio and Lachnospira, the 20–45 region contains a moderately to highly conserved glycine (G) residue spaced 8–9 positions away from an aspartate (D) residue, which are expected to form an isopeptide bond that installs the macrolactam into the N-terminus of the core peptide (Figures 3B,C). The glycine residue is also preceded at position 17 by a highly conserved threonine (T) residue that is often reported as an invariant residue present at the end of the leader peptides of lasso precursors (Knappe et al., 2009; Jia Pan et al., 2012; Hegemann et al., 2013a, 2014). Therefore, this pattern of conserved elements in the precursor sequences matches the chemical/structural properties that have been described for known lasso peptides, confirming their essential role in lasso peptide function and thereby ensuring the reliability of our outputs.

Phylogenetic analysis of the proteins predicted as homologous of the lasso peptide maturation enzymes demonstrated that amino acid sequences of the LasB and LasC proteins belonging to the genera Butyrivibrio, Lachnospira, and Ruminococcus split into distinct phylogroups within the genomes of ruminal bacteria (Figures 4, 5). Also, sequences of the associated maturation enzymes appeared to be more conserved among the strains of Butyrivibrio fibrisolvens and Lachnospira multipartita. The larger distancing of the LasB sequences observed in the clade containing members of the genus Ruminococcus is likely because these protein sequences are fused to a transporter protein.

**Prediction of Putative Lasso Peptide Precursors in the Genomes of Ruminal Bacteria**

Combining our sequence conservation analysis of the putative lasso peptide precursors (LasA) with the requirement of specific residues distributed at particular positions in the amino acid sequences of the mature lasso peptides allowed the identification of novel sequences that were likely to be precursor hits in the genomes of ruminal bacteria. In total, thirty-five LasA-like precursors were predicted in 29 genomes of ruminal bacteria investigated in the current study (Table 3). In Butyrivibrio sp. NC3005, Butyrivibrio sp. YAB3001, Lachnospira multipartita LB2003, Lachnospira pectinoschiza M83, Lachnospiraceae bacterium YSD2013 and Ruminococcus flavaeucens ATCC 19208, at least two distinct LasA precursors were predicted in each genome. The predicted core peptide sequences indicated that the N-terminal isopeptide-bonded ring is likely to occur between a glycine residue (G) at position +1 of the core and an aspartate residue (D) positioned 8–9 aa from the beginning of the core. Also, an invariant threonine residue (T) that has been indicated as a recognition element for the lasso peptide maturation enzymes was found at the end of the predicted leader peptide (position -3 from the start of the core). Our analysis also revealed that most of the identified LasA candidates present a highly conserved serine (S) residue in their C-terminal region. The length of the putative core peptide sequences varied from 21 to 42 amino acid residues, according to the sizes of their respective gene coding sequences (Table 3).

**Expression Analysis of Putative Lasso Peptides Biosynthetic Genes in Ruminal Metatranscriptome Datasets**

Expression of the putative lasso peptide precursors and associated maturation enzymes were generally low in the ruminal metatranscriptome datasets, varying from 0.01 to 4.26 reads per kilobase per million of mapped reads (RPKM). Nonetheless, the expression levels differed between the genes lasA, lasB, and lasC and the number of mapped reads also varied among the datasets of beef cattle, dairy cattle, and sheep examined in the current study. Overall, only reads corresponding to the genes lasA, lasB, and lasC of Ruminococcus albus 8 were represented simultaneously in at least two datasets under study (SRR873462 and SRR873454).

The gene lasC showed the highest number of reads mapping to a putative lasso peptide biosynthetic gene within the active ruminal microbial community, being detected in 13 out of the 15 datasets (Figure 6C). Only reads mapping to the lasC gene of Lachnospira multipartita D15d, Clostridium butyricum

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**Table 2** Conserved motifs in lasso peptide maturation enzymes (LasB, LasC, and LasD) predicted in the genomes of ruminal bacteria.

| Protein | Conserved motifs | Accession | Frequency | Coverage (%) |
|---------|------------------|-----------|-----------|--------------|
| LasB    | Transglut_core3  | pfam13471 | 97%       | 45–100       |
|         | MdiB             | OOG1132   | 6%        | 100          |
| LasC    | AANH_like superfamily | cl00292 | 6%        | 100          |
|         | asn_synth_AEB superfamily | cl36928 | 74%       | 41–100       |
|         | Asn_Synthase_B_C superfamily | cl001991 | 18%       | 100          |
|         | AsnB             | cl00712   | 6%        | 100          |
|         | AsnB superfamily | cl33852   | 6%        | 57–60        |
|         | Gln_AT_IL superfamily | cl03319 | 15%       | 73–100       |
| LasD    | ABC_ATPase superfamily | cl25403 | 10%       | 98–100       |
|         | GinQ             | OOG1126   | 3%        | 100          |
|         | HisM             | OOG0765   | 3%        | 100          |
|         | MdiB             | OOG1132   | 87%       | 89–100       |
|         | SunT superfamily | cl34455   | 3%        | 33           |
|         | UgpA             | OOG1175   | 3%        | 91           |

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**Figure 3A** Grouped the sequences in three phylogroups each consisting of a different number of nodes.
AGR2140, and *Ruminococcus albus* 8 were represented in the rumen of beef cattle, while for dairy cattle datasets, the mapped reads represented the *lasC* gene found in *Butyrivibrio proteoclasticus* B316, *Lachnospira multipara* D15d, and two species of *Clostridium*. The *lasC* gene also appears to be more broadly expressed in the ruminal metatranscriptomes of sheep, as reads of the genes that were found in eight bacterial genomes mapped to at least one out of the five datasets analyzed. Moreover, the expression of the *lasC* gene found in *Clostridium butyricum* ARG2140 and *Lachnospira multipara* D15d occurred across all the dataset groups (beef cattle, dairy cattle, and sheep) evaluated in the current study.

Reads mapping to the predicted *lasA* genes showed higher average RPKM values among the metatranscriptomes evaluated in the current study (Figure 6A). The highest RPKM value (4.26) was observed for reads mapping to the *lasA* sequences of *Butyrivibrio proteoclasticus* B316 in a beef cattle metatranscriptome. Only *lasA* reads from *Butyrivibrio* sp. XPD2006 and *Lachnospiraceae bacterium* YSD2013 (#1) were aligned to the dairy cattle metatranscriptomes. In the active ruminal microbial community of sheep, reads representing the *lasA* sequences of *Lachnospira multipara* D15d and *Ruminococcus albus* 8 mapped to two and three of the datasets under study, respectively.

Among the essential genes of the lasso peptide biosynthesis machinery, the genes corresponding to the maturation enzyme *lasB* were the least expressed across all the ruminal datasets examined in the current study. Only the reads corresponding to the *lasB* gene of *Bacillus* sp. MB2021 and *Ruminococcus albus* 8 could be mapped to a ruminal metatranscriptome, with the majority of the sequences aligned in the dairy cattle and sheep datasets (Figure 6B).

**DISCUSSION**

Lasso peptides represent a group of ribosomally synthesized and post-translationally modified peptides (RiPPs) with unique topology and diverse biological activities. The discovery of new lasso peptides may be hindered by the great sequence...
variation of these molecules. Previously, we applied genome mining approaches to explore the ruminal environment as a potential source of bacteriocins (Azevedo et al., 2015), and non-ribosomal peptides and polyketides (Moreira et al., 2020). Here, we performed an extensive in silico screen in publically available genomes of ruminal bacteria in an attempt to determine the prevalence and diversity of lasso peptides among major species of bacteria from the rumen. Additionally, we sought out to predict potentially novel lasso peptides in the genomes of different members of the rumen microbiome, thus guiding the future identification and characterization of these antimicrobial peptides in ruminal bacteria through in vitro studies.

The genetic screening using antiSMASH 5 and BAGEL4 revealed putative clusters for lasso peptides biosynthesis in 34 ruminal bacterial genomes, representing 8% of the total analyzed. From these, only 11 genomes presented clusters harboring all the essential genes of the biosynthesis machinery of lasso peptides, while in the other genomes the biosynthetic clusters were incomplete. However, after manually curating the genomic context of the incomplete gene clusters, thirty-three rumen bacterial genomes were found harboring complete lasso peptide clusters, confirming the limitations of using homology search tools to identify these biosynthetic genes through automated mining of complete and draft genomes. It should be emphasized, however, that both antiSMASH 5 and BAGEL4 are valuable tools for analyzing and identifying biosynthetic gene clusters in microbial genomes due to their intrinsic processivity, which allows fast screening of multiple datasets of genomic sequences. Nonetheless, computational tools may be limited by inherent constraints of their search algorithms, representativeness of the databases, and by singularities of the lasso peptide gene clusters, such as their small sizes and hypervariability of the precursor gene sequences (Tietz et al., 2017). Therefore, the examination of the genomic context flanking the essential genes may be a useful approach to refine pattern-based genome mining.

Lasso peptide production has been mainly associated with members of the phyla Actinobacteria and Proteobacteria and the best-studied molecules of this family are produced by representative species within these phyla (Weber et al., 1991; Salomon and Farias, 1992; Helynck et al., 1993; Potterat et al., 1994; Tsunakawa et al., 1995; Kimura et al., 1997; Knappe et al., 2008; Hegemann et al., 2013a). Moreover, genome-guided studies focused on natural product discovery often point to these bacterial phyla as promising sources of lasso peptides (Severinov et al., 2007; Hegemann et al., 2013b;
However, our results indicate that genera of the phylum **Firmicutes** are probably the main producers of lasso peptides in the rumen environment, revealing these taxa as potential sources of new lasso peptides. These results are in agreement with a genome-guided exploration of the GenBank database, which highlighted the phyla **Firmicutes**, **Cyanobacteria**, **Euryarchaeota**, and **Bacteroidetes** as underexplored sources of lasso peptides (Tietz et al., 2017). The higher prevalence of lasso peptide gene clusters within the phylum **Firmicutes** reported in this study must take into account the abundance of sequenced genomes compared to other phyla of ruminal bacteria. Nonetheless, the presence of complete biosynthetic clusters observed in multiple strains of the phylum **Firmicutes** may increase the interest in exploring members of these taxa to accelerate the discovery of new bioactive molecules through *in silico* analyses and *in vitro* experimentation.

Analyses of the genomic context allowed the identification of additional co-occurring genes frequently found associated with the lasso peptide biosynthetic gene clusters, such as kinases, glycosyltransferases, and nucleotidylyltransferases (Duquesne et al., 2007b; Tietz et al., 2017; Zybko et al., 2019). These co-occurring genes provide additional evidence of the probable functionality of the gene clusters identified in the rumen bacterial genomes and their association with the essential biosynthesis genes appears to be characteristic among species of the phylum **Firmicutes** (Zhu et al., 2016c). Some of the additional genes flanking the biosynthetic clusters encode tailoring enzymes that introduce chemical modifications to the lasso peptides, including covalent modifications in their C-terminal region, such as phosphorylation (Zhu et al., 2016c), methylation (Gavrish et al., 2014) or acetylation (Zong et al., 2018). For example, HPr kinases found in *Paenibacillus dendritiformis* C454 are capable of modifying a C-terminal Ser in the lasso peptides.
peptide precursor by adding one or more phosphatase groups (Zhu et al., 2016b,c). In *Bacillus pseudomycooides* DSM 12442, producer of pseudomycooidin, the presence of the PsmN, a NADPH:quinone oxidoreductase, was associated with the glycosylation of the C-terminal region (Zyubko et al., 2019). The advantages that these chemical modifications offer to the lasso peptides remains unclear, but they may affect peptide stability (Zyubko et al., 2019), regulate critical processes, such as signaling pathways (Zhu et al., 2016b) or influence the functioning of self-immunity systems in the producer cells (Zhu et al., 2016c; Zong et al., 2018).

A gene encoding a protein belonging to the PqqD enzyme superfamily frequently co-occurred with the lasso peptide biosynthesis genes in species of the genera *Butyrivibrio* and *Lachnospira*. It has been previously reported that the maturation enzyme B can be split between two separate open reading frames (proteins B1 and B2), and this genetic configuration seems a common feature in the lasso peptide gene clusters found in Gram-positive bacteria (Maksimov and Link, 2014; Cheung et al., 2016). Protein B1 is annotated as a homolog of the PqqD enzyme superfamily (Zhu et al., 2016a; Sumida et al., 2019), and acts as a RiPP recognition element that binds the leader peptide homologous to the transglutaminases and is responsible for the processing of the precursor peptide.

The predicted products of the putative biosynthetic genes detected by antiSMASH 5 and BAGEL4 were subjected to motif analysis and results demonstrated that the LasB homologs found in the rumen bacterial genomes harbor conserved motifs of the transglutaminases family, while the predicted LasC homologs contain consensus motifs of the asparagine

| Genome | Predicted leader peptide | Predicted core peptide | Core lenght |
|--------|--------------------------|------------------------|-------------|
| Bacillus cereus KPR-7A | MKDKWTQPTLVEVLNIMTMA | GPQLKTPFDVOQPDVDVHYS | 21 |
| Butyrivibrio fibrisolvens AB2020 | MKAWNTPVIETEINATA | G3GROVSHDGNFVDGIAPEELSGPVER | 29 |
| Butyrivibrio fibrisolvens AR40 | MKWNAPMVLSELNETAK | GSKKSYSEHDGNYSHGDLPAEEASYSPGVAK | 31 |
| Butyrivibrio fibrisolvens DSM 3071 | MKAWNTPVIETEINATA | GSYQTPHDGNFVDGIAPEELSGPVER | 30 |
| Butyrivibrio fibrisolvens MD2001 | MKWNAPMVLSELNETAK | GSKKSYSEHDGNYSHGDLPAEEASYSPGVAK | 31 |
| Butyrivibrio fibrisolvens WTE3004 | MKWNAPMVLSELNETAK | GSYQTPHDGNFVDGIAPEELSGPVER | 30 |
| Butyrivibrio proteoelasticus B316 | MKWNAPKEKELSGLSTQG | GTPNYPGDGKDYDEAQRNEMWFTSQGNNMDTATPGEVGIPG | 42 |
| Butyrivibrio proteoelasticus FD2007 | MKWNTPVEKELSGLTLQH | GDVRFVDSGYDEERNTNWSAYSGQPRNPREDOEVIH | 40 |
| Butyrivibrio sp. FC2001 | MKKWNAPTEALDEIITGAT | GYDTEEDLSEKWFDEEHKQWNLSKAKKEK | 37 |
| Butyrivibrio sp. LN1114 | MKTWNSAEVELALNTAG | GSFDITTHDGGTVYTLTANGROVPSEQAYVSGEQHA | 37 |
| Butyrivibrio sp. MC2021 | MKMNWPAEPIELSTEL | GNRSGYCDAAWSVSEHLKNNFSYSGGDPDNEWNNHPOQ | 41 |
| Butyrivibrio sp. NC3005 (#1, #2) | MKWNAPMVEELNETAN | GMAPNDFDGWEINQGYRPQNGSVMGDEAO | 34 |
| Butyrivibrio sp. NC3005 (#3) | MKWNAPMVEELNETAN | GMAPNDFDGWEINQGYRPQNGSVMGDEAO | 34 |
| Butyrivibrio sp. VCD2006 | MKMNWPAEPIELSTEL | GRNPVYGDGYVVDARETDNWASYSGTSDDPSATGAEVINP | 42 |
| Butyrivibrio sp. XBB1100 | MKTWTSEKELSNTAL | GNARSGYCDAAWSHIELHRNFYSGEGQKKNQQDWTNPQPQ | 42 |
| Butyrivibrio sp. XPO2006 | MKTWNAPVEELISETAQ | GDQAPIAFDRVNDDGTWSSPDSSQQDAOQ | 31 |
| Butyrivibrio sp. YAB3001 (#1) | MKTWLVDEINEFENEL | GSRSKEDNDRQYDGPQDRAGLOQLGGLS | 27 |
| Butyrivibrio sp. YAB3001 (#2) | MKAWNTPVVEIKFTATKE | G3GQKOWKPDHYLDETRNOQWKWEFSGKQLN | 30 |
| Clostridium beijerinckii HUN1142 | MNKTLLKISSEPEVLQDSVQCTQL | GHSHYSSPSDDAPWHDGNOQGQNMWEPGKS | 18 |
| Eubacterium cellobiolum DSM 12606 | MKMNWPAEPIELSTEL | GPWQNTFDSELEAFEDFOVNGYQGDQLGFASQGTGETGTPAV | 44 |
| Lachnospira multipara D15d | MKTWITRVEELVEETAQ | GSKIPSKSGAFRINDEGLNASVES | 25 |
| Lachnospira multipara LB2003 (#1) | MRTWITKPEVELVAAETAQ | GSKIPSSDFERINDEGLNASVES | 25 |
| Lachnospira multipara LB2003 (#2) | MRTWITPVEELVEETAQ | GSKIPSSDFERINDEGLNASVES | 25 |
| Lachnospira multipara MC2003 | MRTWITRVEELVEETAQ | GSKIPSSDFERINDEGLNASVES | 25 |
| Lachnospira multipara ATCC 19207 | MRTWITRVEELVEETAQ | GSKIPSSDFERINDEGLNASVES | 25 |
| Lachnospira pectinischiza M83 (#1) | MRTWITPKEVELVAAETAQ | GSKIPSSDFERINDEGLNASVES | 25 |
| Lachnospira pectinischiza M83 (#2) | MRTWITPVEELVEETAQ | GSKIPSSDFERINDEGLNASVES | 25 |
| Lachnospiraceae bacterium KH1P17 | MKRNWNTEPQELAINATAG | GPOQNHITIDEKTVYDHEEANWYHDFEGDYNTRN | 34 |
| Lachnospiraceae bacterium MA2020 | MKRNWNTEPQELAINATAG | G3QOKTMNDSONWGIWTDPOEGKSWWATGWSG | 30 |
| Lachnospiraceae bacterium YSD2013 (#1) | MKKFVEAELTVLNIADATAF | GPDPPNAPNVDHYKHAVPFTDHEVLVGEereeYQGAESENQNG | 39 |
| Lachnospiraceae bacterium YSD2013 (#2) | MKKFVNAIQEVEAATAF | GPNVDPEVDТKYAVTEEGIRNRRKIFAKASDRQ | 37 |
| Ruminococcus albus 8 | MTNYKPSVEKSSSSHKSTM | GGWFQKFDGFVQGAJWVY | 23 |
| Ruminococcus flavefaciens ATCC 19208 (#1) | MTNYKPSVEKSSSSHKSTM | GLLYQGFKFDGFACKTYFNLAWN | 22 |
| Ruminococcus flavefaciens ATCC 19208 (#2) | MTNYKPSVEKSSSSHKSTM | GLLYQGFKFDGFVQGAJWVY | 23 |

The precursor peptides are composed by the leader peptide + core peptide. Letters in bold represent conserved amino acid residues in the leader and core peptides involved in the maturation or post-translational modification of the lasso peptides. Numbers inside brackets were added when more than one LasA sequence were found in the same genome.
synthetase family. These analyses are in agreement with the genome mining data and provide evidence for the presence of conserved catalytic domains on the enzymes of the lasso peptide maturation pathway. The transglutaminases belong to a large family of cysteine proteases capable of catalyzing the formation of amide crosslinks (Makarova et al., 1999). These enzymes contain the Cys-His-Asp catalytic triad in their active site, which is conserved among the McjB and McjB-like proteins from various bacteria (Duquesne et al., 2007a). Evidence of this catalytic triad was also found on the LasB homologs predicted in the genomes of rumen bacteria investigated in the current study, being particularly conserved in species of Butyrivibrio (Supplementary Figure 3). In the species of Ruminococcus, the LasB homologs contained a fused ABC-transporter domain, a feature that has been previously described for other maturation enzymes of this group (Maksimov and Link, 2014; Tietz et al., 2017).

The phylogenetic analysis of the putative proteins encoded by the lasA, lasB, and lasC genes revealed monophyletic branches composed of strains of the same genera/species. Additionally, the genomic context analysis indicated that the lasso peptide clusters of phylogenetic-related bacteria show the same patterns of genetic organization and considerable conservation of the biosynthetic genes, suggesting that the lasso peptide biosynthetic genes can be inherited vertically, as proposed previously (Tietz et al., 2017).

FIGURE 6 | Expression of putative lasA (A), lasB (B), and lasC (C) genes in different rumen metatranscriptomes. Node sizes represent the relative abundance of reads (expressed as RPKM) mapped to the corresponding bacterial genome in each dataset. The ruminal metatranscriptomes of dairy cattle, beef cattle, and sheep were obtained from the sequence read archive (SRA) in NCBI. The analyses were performed using Bowtie and the alignment was visualized in the software Tablet 1.19.09.03.
peptide synthetases (NRPS) and polyketide synthases (PKS) were more expressed within the biosynthesis showed a low level of expression in the ruminal undesirable bacteria.

The genomes of Bacillus cereus MD2001, Butyrivibrio proteoclasticus FD2007, and Lachnospira multipara MC2003 (Azevedo et al., 2015), while bacteriocin gene clusters were also identified in Ruminococcus albus (Azevedo et al., 2015). Bacteriocin gene clusters were also identified in ruminal bacteria, since the sequences diverged from a common ancestor when compared to the clades that grouped other lasso peptide families.

Some of the bacteria identified in the current study carrying a putative gene cluster for lasso peptide production are also potential producers of other antimicrobial compounds. For example, Ruminococcus albus 8 produces an antagonistic thermostable substance capable of inhibiting Ruminococcus flavefaciens (Odeny et al., 1994). In addition, two gene clusters of sactipeptides and one cluster of a class III bacteriocin were found in Ruminococcus albus 8 (Azevedo et al., 2015). Bacteriocin gene clusters were also identified in the genomes of Butyrivibrio fibrisolvens MD2001, Butyrivibrio proteoclasticus B316, Butyrivibrio proteoclasticus FD2007, and Lachnospira multipara MC2003 (Azevedo et al., 2015), while genes associated with the biosynthesis of non-ribosomal peptides (NRP) and polyketides (PK) were reported in the genomes of Bacillus cereus KPR-7A and Clostridium beijerinckii HUN142 (Moreira et al., 2020). Altogether, the presence of gene clusters encoding for distinct classes of antimicrobial compounds in ruminal bacteria suggest the importance of these molecules in the rumen ecosystem and highlight their potential applications in controlling undesirable bacteria.

The genes considered essential to lasso peptide biosynthesis showed a low level of expression in the ruminal metatranscriptome datasets and were more expressed within the microbial community of the sheep rumen, which is in agreement with our previous observations indicating that non-ribosomal peptide synthetases (NRPS) and polyketide synthases (PKS) were also more abundant in the rumen microbiota of sheep (Moreira et al., 2020). Additionally, the reads corresponding to the genes found in Butyrivibrio sp., Lachnospira sp., and Ruminococcus sp. were most represented in the sheep metatranscriptomes, also confirming previous observations showing a higher prevalence of NRPS and PKS within members of these ruminal taxa (Moreira et al., 2020). Taken together, these results demonstrate the potential production of antimicrobial compounds by species of bacteria colonizing the rumen of sheep, which deserves further investigation.

The metatranscriptome analysis also revealed differences in the expression level of the essential lasso peptide biosynthetic genes (lasA, lasB, and lasC). Reads mapping simultaneously to all three essential genes was only observed for Ruminococcus albus 8 in two datasets from sheep, indicating that in these microbial communities complete biosynthesis machinery could be generated for lasso peptide production. Overall, reads mapping to the putative LasA precursors were more abundant than reads mapping to the maturation enzymes LasB and LasC. These differences may be due to regulation at transcriptional level controlling the gene expression, differences in RNA stability, or other mechanisms that are known to affect the biosynthesis of antimicrobial peptides and other natural products (Hindre et al., 2004; Trmcic et al., 2011).

The genome mining of lasso peptide biosynthetic clusters in genomes of ruminal bacteria confirmed that in silico screening is a fast, effective, and less expensive approach for discovery of these antimicrobial peptides. However, future research should further develop and confirm these initial findings through experiments designed to validate in vitro the production of lasso peptides by ruminal bacteria or heterologous expression of the predicted lasso peptides and to demonstrate their biological activity. Nonetheless, these computational analyses allow to narrow down substantially the genera/species potentially producing lasso peptides in the rumen ecosystem, thus guiding future culture-based efforts. Besides, the peptides predicted in the genomes of ruminal bacteria can serve as scaffolds to develop derivatives with improved antimicrobial activity, stability to proteases and lower cytotoxicity (Pan et al., 2010; Soudy et al., 2012), through chemical synthesis or heterologous expression without the need of culturing the producer organism. Overall, our results reveal that ruminal bacteria harbor the genetic arsenal necessary for the production of several not yet described lasso peptides. The discovery of new peptides from ruminal bacteria reinforces the potential of the rumen microbiome as an important source of secondary metabolites that require future characterization.

**DATA AVAILABILITY STATEMENT**

The datasets presented in this study can be found in online repositories. The names of the repository/repositories and accession number(s) can be found in the article/Supplementary Material.
AUTHOR CONTRIBUTIONS
HM, FA, SH, and TM conceived the project. YS, KA, TL, FA, TM, and SM performed the data analysis and interpretation of results under the supervision of HM. YS, KA, and HM wrote the manuscript. All authors read and approved the final manuscript.

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SUPPLEMENTARY MATERIAL
The Supplementary Material for this article can be found on line at: https://www.frontiersin.org/articles/10.3389/fmicb.2020.576738/full#supplementary-material

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**Conflict of Interest:** 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.

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