

# Multi-omic Directed Discovery of Cellulosomes, Polysaccharide Utilization Loci, and Lignocellulases from an Enriched Rumen Anaerobic Consortium

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ABSTRACT Lignocellulose is one of the most abundant renewable carbon sources, representing an alternative to petroleum for the production of fuel and chemicals. Nonetheless, the lignocellulose saccharification process, to release sugars for downstream applications, is one of the most crucial factors economically challenging to its use. The synergism required among the various carbohydrate-active enzymes (CAZymes) for efficient lignocellulose breakdown is often not satisfactorily achieved with an enzyme mixture from a single strain. To overcome this challenge, enrichment strategies can be applied to develop microbial communities with an efficient CAZyme arsenal, incorporating complementary and synergistic properties, to improve lignocellulose deconstruction. We report a comprehensive and deep analysis of an enriched rumen anaerobic consortium (ERAC) established on sugarcane bagasse (SB). The lignocellulolytic abilities of the ERAC were confirmed by analyzing the depolymerization of bagasse by scanning electron microscopy, enzymatic assays, and mass spectrometry. Taxonomic analysis based on 16S rRNA sequencing elucidated the community enrichment process, which was marked by a higher abundance of Firmicutes and Synergistetes species. Shotgun metagenomic sequencing of the ERAC disclosed 41 metagenome-assembled genomes (MAGs) harboring cellulosomes and polysaccharide utilization loci (PULs), along with a high diversity of CA-Zymes. The amino acid sequences of the majority of the predicted CAZymes (60% of the total) shared less than 90% identity with the sequences found in public databases. Additionally, a clostridial MAG identified in this study produced proteins during consortium development with scaffoldin domains and CAZymes appended to dockerin modules, thus representing a novel cellulosome-producing microorganism.

**IMPORTANCE** The lignocellulolytic ERAC displays a unique set of plant polysaccharide-degrading enzymes (with multimodular characteristics), cellulosomal complexes, and PULs. The MAGs described here represent an expansion of the genetic content of rumen bacterial genomes dedicated to plant polysaccharide degradation, therefore providing a valuable resource for the development of biocatalytic toolbox strategies to be applied to lignocellulose-based biorefineries.

**KEYWORDS** anaerobic consortium, lignocellulose degradation, metagenome, metasecretome, polysaccharide utilization loci, rumen

Lignocellulosic biomass represents the most abundant source of renewable carbon. List is an attractive and sustainable alternative to petroleum for the production of biofuels, chemicals, and other biomaterials (1). For example, large amounts of lignocellulosic residues generated in biorefineries, such as sugarcane bagasse (SB) in bioCitation Tomazetto G, Pimentel AC, Wibberg D, Dixon N, Squina FM. 2020. Multi-omic directed discovery of cellulosomes, polysaccharide utilization loci, and lignocellulases from an enriched rumen anaerobic consortium. Appl Environ Microbiol 86:e00199-20. https://doi.org/10.1128/AEM .00199-20.

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ethanol production plants, could be employed as raw material, instead of being used in boilers as an energy supply (2–4). Lignocellulosic biomass is composed of cellulose, hemicellulose, and lignin, which are highly organized and interlinked by a variety of covalent bonds, forming a recalcitrant structure. Therefore, the bioconversion of lignocellulosic polymers into bioproducts requires an enzymatic cocktail capable of acting on the different bonds of the substrate (2).

In nature, biomass is efficiently degraded by microbial communities present in different ecosystems, such as soil (5), rumen (6–8), and insect gut (9). Overall, the microbial communities are composed of taxonomically different microorganisms capable of secreting a large array of enzymes with different substrate specificities. Among these ecosystems, the rumen microbiome is composed of a highly diverse and complex mixture of bacteria, archaea, fungi, and protozoa with a remarkable ability to break down a variety of biomasses (6, 8, 10, 11). This microbiome represents a promising reservoir of enzymes for applications in lignocellulose-based biorefineries (6, 8, 12).

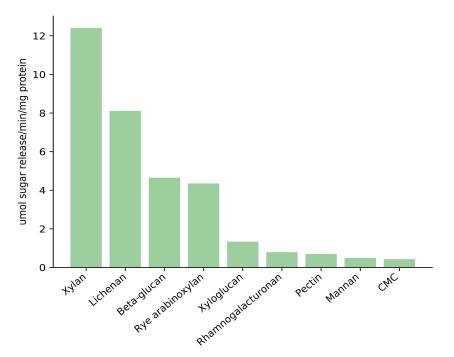
The genomes of rumen microorganisms encode a broad selection of multifunctional carbohydrate-active enzymes (CAZymes), which typically contain a catalytic domain and one or more noncatalytic domains, which include carbohydrate-binding modules (CBM), dockerins, and fibronectin 3-like modules (6, 7, 12, 13). In this biological system, microbial taxa can assemble their CAZymes in multimodular enzymatic complexes. For example, *Clostridium* species can organize a multifunctional enzymatic system (with different catalytic domains) onto a scaffoldin protein, which is attached to the cell surface (14). These multifunctional complexes found in *Clostridium thermocellum* and *Ruminococcus flavefaciens* are termed "cellulosomes" (15).

Some *Bacteroidetes* bacteria possess gene clusters that depolymerize glycans, and these are called polysaccharide utilization loci (PULs) (16, 17). The PULs are gene clusters encoding CAZymes, surface glycan-binding proteins, oligosaccharides transporters, or transcriptional regulators (17). In this system, the bacteria secrete PUL-associated CAZymes that degrade polysaccharides into oligomers, which are transported to the periplasm by transporters encoded by *susCD*-like genes for complete degradation (16, 17).

Several studies based on culture-dependent and -independent methods have uncovered the CAZyme repertoires of rumen anaerobic species, depicting their strategies for lignocellulosic biomass digestion (6, 8, 12, 18). Based on a culture-dependent approach, the Hungate1000 project recently presented the CAZyme profiles of more than 400 bacterial and archaeal genomes of microbial isolates from rumen samples (12). Using culture-independent methods, an ultradeep metagenomic sequencing from 283 cattle samples revealed the CAZyme repertoire of 4,941 rumen uncultured genomes (RUGs) (8). Such genome-centric metagenomic approaches provide more detail that helps provide an understanding of the phylogenetic and metabolic properties of individual genomes, allowing one to propose novel candidate species and comprehension of the syntrophic interactions among members of microbial communities (19-21). By combining metagenomic and metaproteome analyses, it is possible to depict the key enzymes produced during consortium development under precise conditions, rather than just identify the genetic information of the microbial community (22). Independently of the approach applied, these studies consistently report that the rumen microbiome remains a rich and untapped source of new CAZymes and multienzymatic complexes (6-8, 12, 13, 23).

A powerful strategy to disclose enzymatic complexes of relevance for biorefineryrelated applications is based on enrichment strategies (23–27). The enrichment forces shifts in the diversity of microbial communities in response to specific carbon source (28–31). This strategy is not inoculum driven (28) and allows the enrichment of microbial genes related to a specific metabolism (23). A recent study of microbial consortia developed from beaver and moose rumen gut microbiota described the resulting microbial composition, which responded differently to each one of the four lignocellulosic carbon sources used during the enrichment processes (28).

In this study, we established an enriched rumen anaerobic consortium (ERAC),



**FIG 1** Biochemical assays using the enriched rumen anaerobic consortium (ERAC) metaproteome against nine different substrates. Reducing sugars were released from reactions of the ERAC metaproteome against xylan, lichenan,  $\beta$ -glucan, rye arabinoxylan, xyloglucan, rhamnogalacturonan, pectin, mannan, and carboxymethyl cellulose sodium salt (CMC).

enriched for several weeks, using sugarcane bagasse and rumen as unique carbon and microbial sources, respectively. To investigate whether the recalcitrance of the plant biomass selects for promising degrading microorganisms from the rumen endowed with diverse CAZymes and able to induce the production of natural enzymatic cocktails, a multi-omics discovery strategy was applied. The taxonomic analysis, based on bacterial ribosomal gene sequencing, showed the enrichment of phylogenetic groups, known as polysaccharides degraders, such as *Firmicutes* and *Synergistetes*. A metagenomic approach allowed the reconstruction of an extensive repertoire of genes encoding CAZymes, and their protein products were confirmed by metaproteomic analysis. The lignocellulolytic abilities of the anaerobic consortium in the deconstruction of bagasse were further confirmed by scanning electron microscopy (SEM), enzymatic assays, and assessment of the metabolic activity consortium by measurement of the gases produced.

## RESULTS

**Lignocellulolytic evaluation of an ERAC.** An enriched rumen anaerobic consortium (ERAC) was established using a rumen sample as an inoculum, which was then subjected to 25 sequential transfers into fresh medium every 5 days under anaerobic conditions. The detection of carbon dioxide (CO<sub>2</sub>) and hydrogen (H<sub>2</sub>) by gas chromatography (GC)-mass spectrometry (MS) confirmed the anaerobic metabolism of the ERAC (see Table S1 in the supplemental material). As described in Fig. 1, the culture medium supernatant presented the ability to break down natural polysaccharides. The enzymatic assays were performed against nine distinct polysaccharides, with the greatest activity being observed against xylan, lichenan,  $\beta$ -glucan, and rye arabinoxylan, confirming that the consortium was able to produce an array of enzymes for cellulose and hemicellulose degradation.

We examined by SEM whether the ERAC could cause modifications to sugarcane bagasse. Several SEM images of the bagasse samples were obtained prior to and after 7 days of incubation with ERAC (Fig. 2). The sugarcane bagasse control (no incubation)

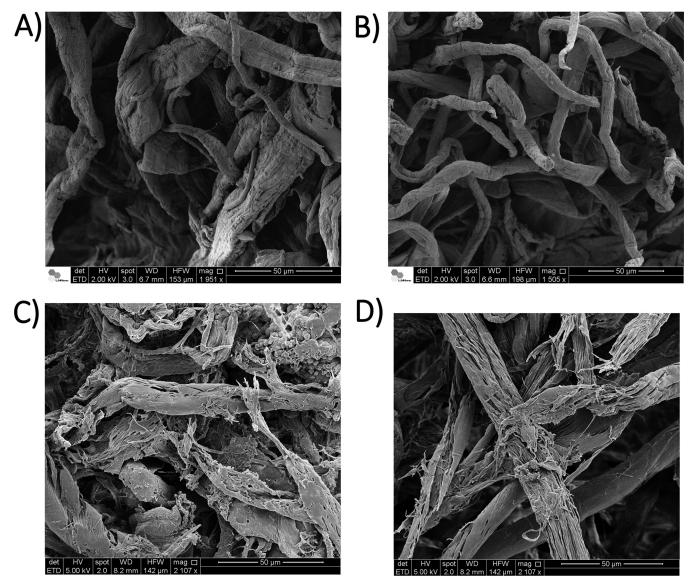
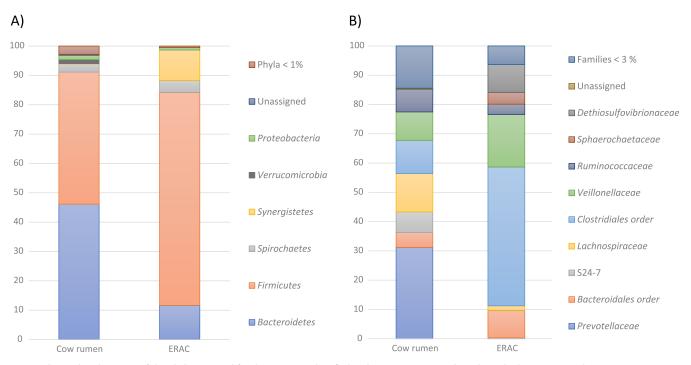


FIG 2 Scanning electron microscopy images of the sugarcane bagasse prior to incubation (A and B) and after 7 days of incubation (C and D) with the enriched rumen anaerobic consortium (ERAC).

showed fibers with a continuous surface (Fig. 2A and B), whereas clear visual signs of decomposition were observed in the bagasse fibers following incubation with ERAC (Fig. 2C and D). Collectively, these functional data confirmed the *ex situ* enrichment of a rumen-derived anaerobic consortium able to break down sugarcane bagasse.

**Impact of enrichment on taxonomic profile and diversity indices.** The impact of enrichment of the cow rumen-derived inoculum sample in response to sugarcane bagasse on the microbial structure, richness, and diversity was determined and calculated based on the 16S rRNA amplicon sequences. High-throughput sequencing yielded 322,680 and 281,340 high-quality sequences for the original cow rumen and ERAC samples, respectively (Table S2). Clustering of these partial 16S rRNA gene sequences resulted in 721 and 312 species-level operational taxonomic units (OTUs) for the cow rumen and ERAC, respectively, indicating a decrease in the biodiversity within the enriched culture. Consistent with this interpretation, richness (ACE and Chao1) and diversity (Shannon and Simpson) indices were lower for ERAC than for cow rumen (Table S3). Moreover, the rarefaction curves reached a plateau in both cases (Fig. S1), suggesting that the microbial communities were entirely covered, permitting a robust estimate of bacterial species richness and diversity.



**FIG 3** Relative abundance (%) of the phylum (A) and family (B) taxons identified in the cow rumen sample and enriched rumen anaerobic consortium (ERAC). Abundances were determined based on the 16S rRNA gene amplicon sequences. Phyla represented by less than 1% and families represented by less than 3% of the total reads were combined in the groups named "Phyla < 1%" and "Families < 3%," respectively.

Figure 3 shows the results of the taxonomic analyses of the cow rumen and ERAC based on representative OTU sequences. In the cow rumen, 16 phyla, 22 classes, 28 orders, 42 families, and 69 genera were detected (Fig. 3; Data Set S1). At the phylum level, *Bacteroidetes* and *Firmicutes* were the dominant phyla, comprising 46.1% and 45.0% of the total sequences, respectively. Following this trend, *Bacteroidales* and *Clostridiales* were the most dominant orders, with *Prevotellaceae* and *Clostridia* representing the prevalent families.

The taxonomic profile and the relative abundance of the phylogenetic groups of the ERAC were significantly different from those of the original microbial community (cow rumen sample), a result consistent with the richness and diversity described above. By comparing the taxonomic profile of ERAC to that of the original ruminal sample, the impact of microbial enrichment was detected, whereby the number of phyla decreased from 16 to 9, and there was a considerable enrichment of Firmicutes and Synergistetes (Fig. 3A; Data Set S1). In comparison to the original sample, the total proportion of sequences assigned to the Firmicutes increased from 45.0% to 72.6%, whereas that of sequences assigned to the Synergistetes increased from 0.1% to 10.4% (Fig. 3A). In contrast, the proportion of sequences related to the Bacteroidetes decreased from 46.1% to 11.6% (Fig. 3A). Within the phylum Synergistetes, Dethiosulfovibrionaceae represented the most enriched family, comprising more than 9% of the community (Fig. 3A). The enrichment also led to a shift in low-rank taxons; for instance, the Veillonellaceae and Clostridiales were enriched in the ERAC, making up 47.4% and 17.9% of the community, respectively (Fig. 3B). In contrast, the proportion of sequences of the Lachnospiraceae decreased from 13.0% to 1.6%. However, the proportion of sequences of the Prevotellaceae decreased to 0.3%, whereas the proportion of sequences of the lineage belonging to the Bacteroidetes increased to 9.3% of the community (Fig. 3B).

**Metagenome sequencing and assembly.** Metagenome shotgun sequencing of the ERAC yielded 21 million high-quality paired-end reads, representing 3.1 GB of sequences. Using *de novo* assembly, 88.2% of the reads were assembled into 103,541 contigs varying in size from 200 to 978,274 bp ( $N_{50}$ , 21,714). The gene prediction depicted 142,703 protein-coding sequences. To gain insight into the diverse biochem-

istry potential of the ERAC, a gene-centric metagenome analysis was carried out based on the Clusters of Orthologous Groups (COG), KEGG, and Pfam annotations.

A total of 99,763 (69.9%) predicted genes were classified according to COG categories, 63,855 (44.7%) were identified in the KEGG database, and 95,457 (66.9%) had at least one protein domain predicted according to the Pfam database. Although the annotation based on COG identified more genes than the KEGG analysis, both sets of results indicated that most of the protein-coding genes were classified in the metabolism category (Fig. S3 and S4). Within the metabolism category, a high proportion of genes was associated with carbohydrate and amino acid metabolism.

Additionally, we applied a Pfam-based analysis, as described previously (26), to investigate whether conserved domains related to lignin and aromatic degradation were present in the ERAC metagenome data. Domains of peroxidases, laccases, catalases, as well enzymes that cleave lignin linkages, such as  $\beta$ -aryl ether bonds, biphenyl linkages, and hydroxyl groups (*ortho* cleavage), were found in the ERAC metagenomic data (Table S4), suggesting the potential for lignin degradation.

**CAZyme profile of the ERAC.** To investigate the anaerobic consortium genomic content for plant biomass breakdown, the ERAC metagenome sequences were screened against the hidden Markov model (HMM) profile-based database dbCAN (32). According to the CAZy database classification scheme, of the 142,703 predicted proteins, 5,070, representing 3.5% of the total predicted proteins, were predicted to have at least one carbohydrate-active function. The ERAC metagenome contains 2,158 glycoside hydrolase (GHs) modules, 695 carbohydrate-binding modules (CBMs), 17 cohesin modules, 159 dockerin modules, 1,457 glycosyltransferase (GT) modules, 858 carbohydrate esterase (CE) modules, 69 polysaccharide lyase (PL) modules, 176 auxiliary activity (AA) modules, and 175 S-layer homology (SLH) modules. An overview of all predicted families in the CAZy database is described in Table 1, as well as in Data Set S2 in the supplemental material.

Analyzing in more detail the CAZyme prediction, the ERAC contained 92 distinct GH families. Among them, we found GH families encoding cellulases, oligosaccharidedegrading enzymes, mannases, pectinases, chitinases,  $\alpha$ -amylases, and xylanases. The remaining CAZyme families identified in the ERAC, such as CE, PL, and AA families (Data Set S2), also play important roles in lignocellulose breakdown (33, 34). Among them, we found families encoding enzymes for xylan, pectin, and alginate degradation. Furthermore, we noticed nonhydrolytic accessory CBMs, which are protein domains found in carbohydrate-active enzymes that can potentiate the activity of the associated catalytic domains (33). The set of predicted CBMs in the ERAC comprised 43 families, including CBMs that bind to xylan, cellulose, starch, pullulan, and glucans (Table 1 and Data Set S2).

Overall, the ERAC is composed of microorganisms carrying a wide variety of carbohydrate-degrading genes with the potential to produce a broad range of enzymatic activities to deconstruct all components of the plant cell wall. A complete description of the families and their corresponding enzymatic activities is given in the supplemental material.

**Novel CAZymes and prediction of multimodular proteins.** To confirm the novelty of the enzymes identified in this study, the CAZyme content in the ERAC was compared to the entries in the CAZy database (as described previously [23]). Considering the GH, CE, PL, and AA classes, which are classes more often involved in biomass breakdown, we found that 3,042 CAZyme sequences predicted in the ERAC (60% of the total) had less than 90% identity to the amino acid sequences reported in the CAZy database (Fig. 4). These CAZyme sequences include cellulases, xylanases, pectate lyases, carbohydrate esterases, etc. Interestingly, among the CAZyme classes depicted in the ERAC, the AA family members had the lowest similarity match compared to that of the other families in the CAZy database (Fig. 4).

CAZymes tend to be modular proteins composed of both catalytic and noncatalytic accessory domains (e.g., CBMs, dockerin modules, or SLH modules) (35). The presence

**TABLE 1** The most common CAZyme modules predicted in the total ERAC metagenome and their relative abundance in ERACgs, according to their representation in the CAZy database<sup>a</sup>

	No. of CAZyme modules	
Family	Total metagenome	ERACgs
Most common GH families		
GH13	181	147
GH3	126	100
GH2	117	101
GH43	117	84
GH23	84	56
GH5	69	47
GH25	67	47
GH77	56	41
GH31	52	39
Most common CBM families		
CBM50	187	139
CBM32	98	80
CBM48	66	53
CBM6	33	15
CBM67	29	27
Most common CE families		
CE1	223	139
CE10	173	122
CE4	148	110
CE3	92	60
CE9	43	28
CE1	223	139
Most common PL families		
PL12	18	13
PL22	14	14
PL1	11	7
Most common AA families		
AA6	136	83
AA3	17	10

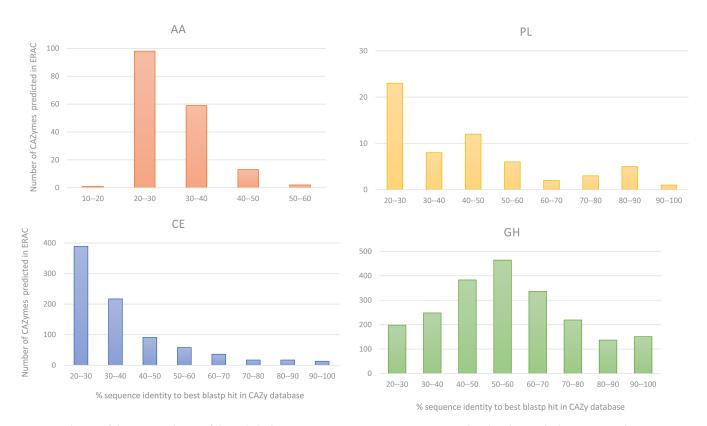
<sup>a</sup>Abbreviations: ERAC, enriched rumen anaerobic consortium; ERACgs, enriched rumen anaerobic consortium genomes; CAZyme and CAZy, carbohydrate-active enzyme; GH, glycoside hydrolase; CBM, carbohydratebinding module; CE, carbohydrate esterases; PL, polysaccharide lyases; AA, auxiliary activities.

of noncatalytic domains appended to CAZymes indicates (i) improved enzymatic efficiency due to a substrate proximity effect mediated by the binding domain or (ii) that CAZymes may be organized in enzymatic complexes or free-enzyme systems. We further investigated whether the CBM, dockerin, and SLH sequences from ERAC were appended to catalytic CAZyme domains, forming multiple-domain proteins. Approximately 14% (711) of the GH, CE, and PL sequences in the ERAC were predicted to have at least one additional domain, indicating that the ERAC CAZymes may be organized in enzymatic complexes or free-enzyme systems (Tables S5 to S7 and Data Set S2).

Of the predicted CBM sequences, 53% of the sequences were appended to CA-Zymes, forming 165 distinct types of genetic multimodular structures (Tables S1 and S5). Thirty-seven GH, 7 CE, and 2 PL family members contained dockerin modules; in addition, CBM families were depicted in these protein sequences. The multimodular CAZymes identified in the ERAC were also previously related to the degradation of starch (CBM48-GH13\_9 and CBM34-GH13\_2), pectinases (CBM67-GH78), acetylated polysaccharides (CBM48-CE1), and oligosaccharides (GH43\_35-CBM6) (36–38). The most frequent multidomain protein sequences found in the ERAC were CBM48-GH13\_9, CBM67-GH78, CBM34-GH13\_20, and CBM48-CE1.

Of the multimodular dockerin-containing proteins with a predicted catalytic function, the most prevalent sequences were found to be appended to peptidase domains.

#### Tomazetto et al.



**FIG 4** Distribution of the percent identity of the carbohydrate-active enzyme (CAZyme) sequences predicted in the enriched rumen anaerobic consortium (ERAC) against the four classes of the CAZy database. Only the maximum percent identities for each CAZyme ERAC were considered. GH, glycoside hydrolase; PL, polysaccharide lyases; CE, carbohydrate esterases; AA, auxiliary activities.

Previous studies suggest that this modular organization may be involved in microbial competition or may permit these enzymes to act in synergy with cellulases for carbohydrate processing (39, 40). Several dockerin modules were also predicted to be appended to the CE and/or GH families in the ERAC, indicating that these sequences are linked to potential cellulosomes. In addition, several sequences harboring cohesin and SLH modules were identified, providing additional evidence of microorganisms within the ERAC able to produce cellulosomes.

The remaining CBM, dockerin, or SLH sequences appended to domains without a predicted function were further subjected to Pfam domain annotation using the WebMGA web server (41) to classify domains of unknown function (DUF). The analysis of multimodular proteins comprising DUF appended to noncatalytic accessory domains is a relevant approach for the discovery and exploitation of new CAZyme family members (23). From the DUF screening strategy, we identified 28 DUFs appended to nine CBM family, dockerin module, and SLH module sequences, comprising 30 different types of domain organizations (Table S7).

**Reconstructed genomes with a potential lignocellulolytic capacity.** In addition to metagenome assembly, the reconstruction of genomes directly from metagenome data sets has become a powerful strategy to link the metabolic and functional potential with phylogenetic information (8). The metagenome-assembled genomes (MAGs), named enriched rumen anaerobic consortium genomes (ERACgs), were assessed in terms of their completeness and contamination, based on the presence or absence of sets of colocalized single-copy marker genes within a reference genome tree (42). This resulted in 19 ERACgs that were nearly complete ( $\geq$ 90% completeness), 19 that were substantially complete ( $\geq$ 70%), and 3 that were moderately complete ( $\geq$ 50%) (Table 2). Based on the same criteria, 4 ERACgs that displayed a low contamination level ( $\leq$ 2%) were maintained in the subsequent analysis. The size of the ERACgs ranged from 1.39

<b>TABLE 2</b> Genomic features of	<sup>ERACqs</sup> from	ERAC metagenome	shotgun seguencing <sup>a</sup>

	Phyla-AMPHORA cla	assification	Completeness	Contamination	Genome	Predicted no.	GC	No. of
ERACg identifi	er Class	Predicted taxon	(%)	(%)	size (Mb)	of genes	content (%)	CAZymes
ERACg_2	Clostridia	Butyrivibrio	96.6	0	2.65	2,421	38.2	106
ERACg_3	Clostridia	Ruminiclostridium	95.3	0	2.76	2,608	49.4	63
ERACg_5	Clostridia	Clostridium	89.2	0	2.29	1,970	51.2	50
ERACg_9	Clostridia	Clostridium	92.6	0	3.53	3,317	57.5	186
ERACg_11	Clostridia	Butyrivibrio	95.9	0	2.99	2,705	43.6	156
ERACg_12	Clostridia	Oscillibacter	91.9	0	2.36	2,169	52.5	52
ERACg_13	Clostridia	Oscillibacter	78.4	0	2.42	2,356	62.9	81
ERACg_15	Clostridia	Clostridiales	83.8	0	2.30	2,277	55	50
ERACg_16	Clostridia	Oscillibacter	92.6	0	1.97	1,904	59.5	42
ERACg_21	Clostridia	Clostridium	84.5	0	2.78	2,576	56.4	99
ERACg_23	Clostridia	Clostridium	81.7	2.5	3.56	3,485	31	101
ERACg_25	Clostridia	Desulfitobacterium	95.3	0	2.57	2,387	39.1	49
ERACg_26	Clostridia	Oscillibacter	93.2	0	2.35	2,275	60.2	61
ERACg_32	Clostridia	Butyrivibrio	93.9	0	3.09	2,790	45.2	168
ERACg_42	Clostridia	Ruminococcus	95.3	0	2.79	2,496	48.3	180
ERACg_45	Clostridia	Alkaliphilus	91.2	0	2.31	2,292	30.5	65
ERACg_48	Clostridia	Filifactor	88.5	0	1.75	1,665	47.6	55
ERACg_50	Clostridia	Clostridium	91.9	0	2.59	2,624	28.3	50
ERACg_57	Clostridia	Butyrivibrio	93.9	0	4.48	3,824	42.4	135
ERACg_58	Clostridia	Clostridiales	91.2	0	1.57	1,409	56	12
ERACg_41	Bacilli	Streptococcus	97.3	0	2.05	1,823	51.2	56
ERACg_8	Bacilli	Enterococcus	96.6	0	3.11	2,772	53.9	50
ERACg_1	Erysipelotrichia	Erysipelothrix	87.8	0	1.39	1,245	32.2	43
ERACg_19	Bacteroidia	Prevotella	62.8	0	1.81	1,468	52.7	115
ERACg_30	Bacteroidia	Porphyromonadaceae	83.1	0	2.25	1,861	49.1	164
ERACg_35	Bacteroidia	Bacteroides	91.9	0	2.23	1,924	50	113
ERACg_37	Bacteroidia	Bacteroides	84.5	0	3.14	2,574	46	136
ERACg_43	Bacteroidia	Bacteroides	92.6	0	3.95	3,136	46.6	336
ERACg 55	Bacteroidia	Prevotella	79.1	0	2.54	2,081	56	128
ERACg_56	Bacteroidia	Prevotella	68.2	0	2.05	1,650	53.6	140
ERACg_14	Spirochaetia	Sphaerochaeta	85.8	0	2.63	2,307	54.9	78
ERACg_31	, Spirochaetia	Treponema	81.8	0.7	3.13	2,774	36.5	112
ERACg_36	Spirochaetia	Sphaerochaeta	81.8	1.7	2.59	2,431	50	82
ERACg_52	Spirochaetia	Treponema	80.4	0	2.76	2,364	38.3	81
ERACg_4	, Synergistia	Aminobacterium	65.5	0	4.51	3,901	43.3	358
ERACq_38	Synergistia	Aminobacterium	89.9	0	4.07	3,935	44.5	72
ERACg_49	Synergistia	Aminobacterium	91.2	0	2.24	2,154	41.5	47
ERACg_18	Deltaproteobacteria	Proteobacteria	76.4	1.22	2.21	2,175	57.4	41
ERACg_34	Deltaproteobacteria	Desulfovibrio	85.8	0	2.69	2,260	64.7	61
ERACg_54	Deltaproteobacteria	Desulfovibrio	89.2	0	3.35	3,152	66.5	99
ERAC_46	Alphaproteobacteria		85.8	0	2.49	2,428	60.8	43

<sup>a</sup>Abbreviations: ERACg, enriched rumen anaerobic consortium genomes; ERAC, enriched rumen anaerobic consortium. <sup>b</sup>Total number of carbohydrate-active enzymes (CAZymes) predicted.

and 4.51 MB, the GC content varied from 28.3 to 66.5%, and between 1,245 and 3,935 coding sequences (CDS) were predicted (Table 2).

The ERACgs were assigned to the lowest taxonomic level that could be confidently determined by phylogenetic marker genes. The phylum *Firmicutes*, the predominant phylogenetic group, was represented by 20 ERACgs assigned to the *Clostridia* class, followed by the *Bacilli* (2 ERACgs) and *Erysipelotrichia* (1 ERACg) classes. The second and third most abundant groups were assigned to the *Bacteroidia* (7 ERACgs) and *Spirochaetia* (4 ERACgs) classes. The remaining ERACgs were assigned to the *Synergistia* (3 ERACgs), *Deltaproteobacteria* (3 ERACgs), and *Alphaproteobacteria* (1 ERACg) classes.

The ERACg genetic content related to lignocellulose hydrolysis was investigated in detail. The ERACgs contained approximately 72% of the total predicted CAZymes in the ERAC (Fig. 5). *Clostridia* and *Bacteroidia* ERACgs harbored the highest number of predicted GHs (Fig. 5; Data Set S2), accounting for 56% (1,207 out of 2,158) of the total number of GH domains encountered in the ERAC. Seven (out of 20) *Clostridia* ERACgs and all *Bacteroidia* ERACgs harbored more than 100 CAZymes (Table 2).

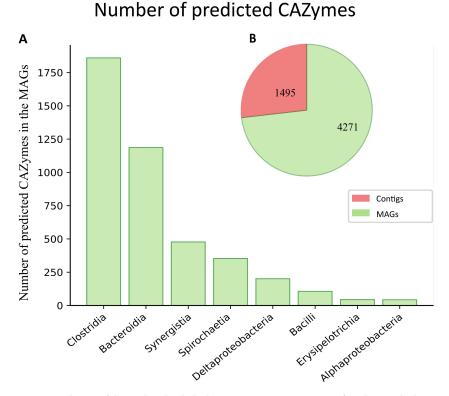


FIG 5 (A) Distribution of the predicted carbohydrate-active enzymes (CAZymes) found in enriched rumen anaerobic consortium genomes (ERACgs) at the class level. (B) Total CAZymes found in the rumenderived anaerobic microbial consortium (enriched rumen anaerobic consortium [ERAC]) metagenome data. Red, nonbinned metagenome contigs; green, ERACgs.

These two phylogenetic groups encoded 65 and 66 distinct GH families (Data Set S2), respectively.

In general, *Clostridia* and *Bacteroidia* ERACgs harbored a diverse repertoire of GHs which was capable of degrading cellulose, hemicellulose, starch, and pectin (Fig. 6). Although the cellulases were not among the most abundant GH domains in the ERACgs, six distinct families were depicted: GH5, GH9, GH30, GH51, GH74, and GH94. These were predicted mainly in *Clostridia* and *Bacteroidia* ERACgs (Fig. 6; Data Set S2). These ERACgs also showed the highest abundance of the CE, PL, and AA families (Data Set S2).

The high diversity of CAZyme families was also observed in the remaining ERACgs (*Spirochaetia*, *Synergistia*, and *Proteobacteria*). The *Spirochaetia* and *Synergistia* ERACgs possessed 39 and 49 distinct GH families, respectively (Fig. 6; Data Set S2). Nonetheless, the numbers of CAZymes predicted in these groups were not high. These groups accounted for 19.4% of the total GH count predicted in the ERAC. Within this group, only *Treponema* sp. ERACg\_31 and *Aminobacterium* sp. ERACg\_4 encoded more than 100 CAZymes (Table 2). Moreover, *Aminobacterium* sp. ERACg\_4 harbored the highest number of predicted CAZymes among ERACgs, encoding 358 CAZymes, indicating a full capacity to fully degrade plant cell wall polysaccharides.

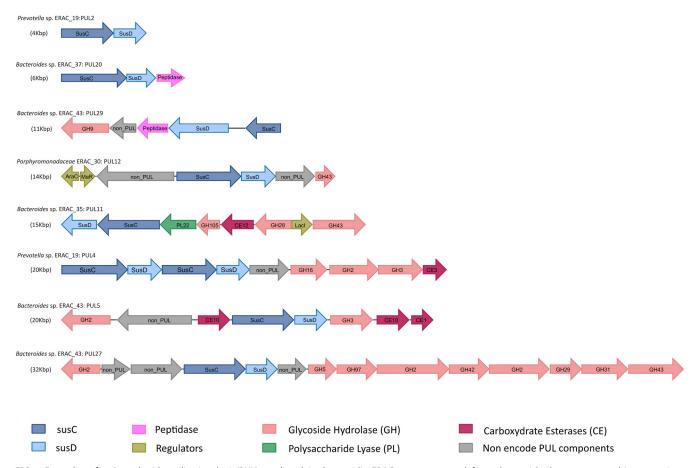
By comparing the enzymatic sets among the phylogenetic groups, in general, *Spirochaetia* ERACgs had a potential capacity to degrade biomass similar to that of *Clostridia* and *Bacteroidia* ERACgs (Fig. 6). The remaining *Synergistia* and *Proteobacteria* ERACgs had an enzymatic set restricted to the degradation of starch.

**Macromolecular enzymatic complexes: cellulosomes and PULs.** Besides the CAZyme profile, we also investigated the ability of the ERACgs to produce multienzyme complexes, such as cellulosomes and PULs. These multidomain macromolecular enzymatic complexes are highly efficient metabolic systems that break down polysaccharide

														Fir	mic	ute	s												Bc	ac te	eroi	dete	es		Spi	roch	aete	es	Syr	nergi	stete.	$s \mid P$	rote	obac	teria	
Enzymes	GH	ERAC_2	ERAC 3	ERAC 5		ENAC_7	EKAC_II	ERAC_12	ERAC_13	ERAC 15		EKAC_10	ERAC_21	ERAC_23	ERAC_25	ERAC_26	ERAC_32	ERAC_42	ERAC_45	ERAC_48	ERAC 50	ERAC 57	ERAC 58	ERAC 8	ERAC 41	EPAC 1		ERAC_19	ERAC_30	ERAC_35	ERAC_37	ERAC_43	ERAC_55	ERAC_56	ERAC_14	ERAC_31	ERAC_36	ERAC_52	ERAC_4	ERAC_38	ERAC_49	ERAC_18	ERAC 34	ERAC 54	ERAC 46	
Cellulase	GH5 GH9 GH44 GH48	2 0 0 0		)	0 0 0 0	0 1 0 0	2 2 0 0	0 0 0	0 0 0		0 0 0 0	0 0 0	0 0 0 0	0 0 0 0	1 0 0	000000000000000000000000000000000000000		8	000000000000000000000000000000000000000	1	(	) (	_		) (	0	1 0 0 0	1 0 0 0	1 0 0	2 1 0 0	1 0 0	5 7 0 0	1 1 0 0	3 0 0 0	0 0 0 0	5 0 0 0	0 0 0 0	0 0 0 0	9 0 0 0	0 0 0 0	0 0 0 0	0 0 0 0 0	(	0 0 0	0 0 0	
Hemicellulase	GH8 GH10 GH11 GH16 GH26 GH30 GH36 GH36 GH51 GH53 GH55 GH67 GH74 GH76 GH72 GH125 GH125 GH127 GH99 GH115 GH120 GH114 GH1	0 0 1 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0				0 0 1 0 0 3 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	1 2 0 3 0 0 4 2 3 1 0 4 2 3 1 0 0 0 0 0 0 0 0 0 0 0 1 0 0 0 2 0 0				0 0 0 0 0 0 0 0 1 1 0 0 0 0 0 0 0 0 0 0	0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0					1 4 1 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	4 2 2 3 2 0					, , , , , , , , , , , , , , , , , , ,				0 0 3 0 1 1 1 0 0 0 0 0 0 0 0 0 0 0 0 0	0 0 3 0 2 0 7 3 1 0 0 0 0 0 0 1 1 2 0 0 1 1 0 0 0 1 0 0 0 0	0 0 0 2 3 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0	0 0 0 1 1 1 1 0 0 0 0 0 0 0 0 0 0 0 0 0	0 0 3 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	0 0 1 3 3 1 14 3 1 3 1 3 0 4 3 10 4 3 10 4 3 1 0 0 0 0 0 0	0 0 0 0 0 0 0 0 0 0 0 0 0 0	1 0 1 1 1 1 1 1 1 1 1 1 1 1 3 0 0 0 0 0		4 0 0 1 0 1 0 0 0 0 0 0 0 0 0 0 0 0 0 0	0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0		3 0 4 1 4 6 21 3 2 0 1 0 2 9 1 6 1 0 0 0 0 0 0		0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0		(			
Oligosaccharide-degrading	GH2 GH3 GH27 GH29 GH31 GH37 GH37 GH37 GH37 GH37 GH2 GH94 GH95 GH94 GH106 GH110 GH116 GH144	3 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0				2 8 110 1 2 1 0 0 2 0 0 3 0 1 2 0 1 2 0 1 0 1 0 1 0 0 1 0 0 0 1 0 0 0 1 2 0 0 1 0 0 0 2 0 0 0 1 0 0 0 0	4 6 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0					0 0 2 0 0 0 0 0 0 0 0 0 0 0 0 0	4 2 0 0 5 0 0 0 0 0 0 1 1 0 0 0 0 1 0 0 0 0	6 1 0 0 3 3 0 2 0 0 0 0 0 0 0 0 0 0 0 0 0 0			55 66 11 13 30 00 00 00 00 00 00 00 00 00 00 00 00	22 33 00 00 00 00 00 00 00 00 00 00 00 00					) ) ) ) ) ) ) ) ) ) ) ) ) ) )				1 1 1 0 0 1 0 0 0 0 0 0 0 0 0 0 0 0 0	4 2 0 3 2 1 0 0 0 0 0 0 0 0 0 0 0 0 0	5 6 1 3 0 1 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	4 4 0 3 2 0 1 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	5 2 0 2 1 0 0 0 0 0 0 0 0 1 1 0 0 1 1 0 0 0 1 1 0 0 0 0	20 19 2 2 6 1 0 3 0 1 1 3 9 0 0 0 3 0 0 3 0 4	0 0 5 0 1 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	4 2 1 2 1 0 0 0 0 0 0 0 0 0 0 0 0 0 0 1 2 1 2	3         3         0         0         0         0         1         0 <td< td=""><td>1           4           1           0           2           0           0           0           1           0           0           1           0           0           1           0</td><td>0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0</td><td>1 2 0 0 1 1 0 0 0 0 0 0 0 0 0 0 0 0 0 0</td><td>14           5           0           7           2           1           0           1           0           0           0           0           0           0           0           0           0           0           2           4           3           1           0           0</td><td></td><td></td><td></td><td></td><td></td><td></td><td></td></td<>	1           4           1           0           2           0           0           0           1           0           0           1           0           0           1           0	0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	1 2 0 0 1 1 0 0 0 0 0 0 0 0 0 0 0 0 0 0	14           5           0           7           2           1           0           1           0           0           0           0           0           0           0           0           0           0           2           4           3           1           0           0							
Amylase	GH13 GH57 GH77 GH126		( ( (	2	5 0 2 0	7 0 2 0	13 0 1 0	0 0 0 0	2 0 1 0		0	0 0 0 0	0	2 0	0	0	2	1 0	1	1			l )	) (		0 1 0	6 0 1 0	4 0 1 0	4 1 1 0	5 1 1 0	5 1 1 0	7 1 1 0	6 1 1 0	1 0 0	4 3 2 0	4 2 3 0	3 3 1 0	2 2 1 0	6 1 1 0	2 2 2 0	1 1 1	1 1 1 0		0		
se	GH133 GH28	1 0	(		0	0	0	0	0		0	0	0	0	0				0								0 2	0	1	1	1 0	1	1	0	0	0	0	0	1	0	0	1	1			
Pectina	GH28 GH78 GH105	0	(	)	0	1	0	0	0		0	0	0	1	0	0	0	0	0	0	) (	) (	)	) (	) (	0	0	0	9	2	0	2	0	4	0	0	0	0	12 6	0	0	0	(	0	0	

FIG 6 Heat map displaying the distribution of the most abundant glycoside hydrolases (GH<sup>1</sup>) found in the ERACgs from ERAC. GH families were grouped according to their action on components of the plant cell wall.

complex substrates (16, 43–45). The cellulosomes comprise a combination of dockerinbearing catalytic domains that bind the cohesin modules, which are part of noncatalytic structural proteins called scaffoldins (14). Moreover, cellulosomes can be subdivided into both simple and highly structured multidomain macromolecule structures, which are composed of more than one scaffoldin protein (45). The PULs comprise a series of linked genes encoding all activities necessary to bind, transport, and depolymerize a



**FIG 7** Examples of polysaccharide utilization loci (PUL) predicted in *Bacteroidia* ERACgs reconstructed from the enriched rumen anaerobic consortium metagenome. To facilitate the visualization of gene arrangements, the predicted proteins were colored according to the function of the encoded proteins: SusC, SusD, glycoside hydrolase (GH), polysaccharide lyase (PL), carbohydrate esterase (CE), peptidase, and regulators (AraC, MaR, Lacl). Genes that do not encode PUL components or that encode hypothetical proteins are identified as non-PUL genes. All PULs predicted in *Bacteroidia* ERACgs are presented in Data Set S2 in the supplemental material.

broad type of glucan (16). The PULs are organized around tandem *susCD*-like pairs encoding integral membrane proteins and extracellular lipoproteins.

Potential cellulosomes and PULs were both identified among the ERACg genes encoding cellulosomal proteins (cohesin and dockerin modules) and SusCD-like pairs, respectively. In addition, these protein sequences were manually curated based on BLASTp analysis to confirm the identity of the conserved protein domains. The screen revealed four ERACgs (ERACg\_32, ERACg\_42, ERACg\_50, and ERACg\_57) assigned to *Clostridia* encoding putative scaffoldins (Table S8) and all *Bacteroidia* ERACgs encoding PULs (Fig. 7; Data Set S3). Among the potential cellulosome-producing *Clostridia* ERACgs, a detailed analysis indicated that the only *Ruminococcus* sp. ERACg\_42 has multimodular CAZymes that co-occur with dockerin, which is essential for the assembly of the cellulosomes (45), thus representing a unique ERACg able to produce cellulo-somes.

Regarding PUL prediction, a total of 154 PULs were identified in all ERACgs assigned to *Bacteroidia*, and the number per genome varied from 3 to 50 (Fig. 7; Data Set S3). ERACg\_37 and ERACg\_43, both assigned to the *Bacteroides* genus, contained 39 and 50 PULs, respectively, representing the ERACgs with the highest number of predicted PULs. The remaining ERACgs harbored fewer PULs, such as *Prevotella* sp. ERACg\_19 (10 PULs), *Porphyromonadaceae* ERACg\_30 (27 PULs), *Bacteroides* sp. ERACg\_35 (12 PULs), *Prevotella* sp. ERACg\_55 (13 PULs), and *Prevotella* sp. ERACg\_56 (3 PULs). Sixtynine PULs were associated with genes encoding CAZymes, peptidases, transporters, and transcriptional regulators (e.g., hybrid two-component systems [HTCS], AraC, GntR),

indicating the presence of complete systems capable of degrading polysaccharide and proteins (Data Set S3). We counted 47 distinct CAZyme families associated with PULs, implying that PULs may be able to degrade many kinds of complex lignocellulose substrates. Among the CAZyme predictions associated with PULs, we encountered putative cellulases (GH5 and GH9), amylases (GH13 and GH97), mixed-linkage  $\beta$ -glucanases (GH16), and oligosaccharide-degrading enzymes (GH3 and GH31) (Data Set S3). The CE families, such as CE1, CE6, CE10, and CE12, were also associated with a tandem *susCD* gene pair.

An illustrative example of the PUL diversity found in the different ERACgs is shown in Fig. 7. Some PULs are composed of enzymes targeting specific substrates or a broader pool of substrates. For example, ERACg\_46 harbors a cluster (PUL27) encoding seven different CAZymes, of which five are oligosaccharide-degrading enzymes (GH2, GH29, GH31, GH42, and GH97), one is cellulase (GH5), and the last one is potentially involved in xylan degradation (GH43), whereas PUL4 from *Prevotella* sp. ERACg\_19 encodes enzymes that degrade hemicellulose (GH16 and CE3) and oligosaccharides (GH2 and GH3). *Prevotella* sp. ERACg\_19 also has other clusters (PUL29) composed of genes encoding enzymes for cellulose (GH9) and protein degradation (peptidase).

Previously, metagenome analysis of cow rumen (46) and moose rumen (6) found PULs containing dockerin modules appended to GHs. In our study, we also found dockerin-containing proteins in *Prevotella* sp. ERACg\_55 and *Prevotella* sp. ERACg\_56, which were ERACgs affiliated with the *Bacteroidia* class. These dockerin-containing genetic structures were appended to GH modules, DUFs, and CBM modules, but none were found to be associated with PULs. Although the presence of dockerin modules in PULs from rumen *Bacteroidetes* was previously reported (6, 46), the functional role of these modules in this genetic context is not defined yet.

**Metaproteome for ERAC.** Metaproteome analysis is a powerful strategy to illustrate which phylotypes are actively producing enzymes in microbial communities. The approach proposes a direct link between biotechnologically relevant enzyme activity and the corresponding gene encoding the enzyme (22). To experimentally reveal the set of CAZymes found from the consortium metaproteome, as well as to confirm the production of cellulosomes, we applied a mass spectrometry-based method. For this purpose, the culture supernatant was taken for metaproteome analysis after 5 days of growth in fresh medium (after 25 cycles of medium transfer).

A total of 334 proteins were detected in the ERAC metaproteome (Data Set S4). Analysis of the taxonomic origin of the secreted proteins confirmed that 36 of the ERACgs identified in the ERAC metagenomic data were metabolically active. Nonetheless, examining in detail the function and distribution of the secreted proteins, *Ruminococcus* sp. ERACg\_42 in the consortium showed the highest number of different proteins identified in the metaproteome, representing 39.5% of the total proteins detected (Tables 3 and 4; Tables S9 and S10). Most proteins secreted by *Ruminococcus* sp. ERACg\_42 were related to cellulosomal proteins, indicating the production of cellulosomes.

Besides the identification of the cellulosomes, the metaproteome analysis also experimentally confirmed a second enzymatic complex, a PUL from *Bacteroides* sp. ERACg\_43, which was also predicted from the ERAC metagenome data (Table 3). Although the CAZymes were not detected from *Bacteroides* sp. ERACg\_43 in this analysis, the identification of SusCD proteins proves that this enzymatic complex is produced by this phylotype.

**Taxonomic and CAZyme analyses of** *Ruminococcus* **ERACg\_42.** *Ruminococcus* species, which fall within the phylum *Firmicutes*, are found in anaerobic environments, including the human gut (e.g., *Ruminococcus champanellensis* [47]), biogas (e.g., *Clostridium bornimense* [48]), and rumen (e.g., *R. flavefaciens* [49]). Some *Ruminococcus* isolates are described to be cellulosome-producing bacteria, thus representing important microorganisms for biotechnological application related to biofuel production from lignocellulosic biomass (49–51).

ERACg identifier	Predicted protein	Modular architecture	Signal peptide <sup>b</sup>	Total spectral count <sup>c</sup>
Butyrivibrio sp. ERACg_32	Cellulosomal protein	CBM6-CBM6-CBM6-CBM6-CBM2	Yes	14
Ruminococcus sp. ERACg_42	Putative scaffoldin	6 $ imes$ cohesin_I-CttA	Yes	10
Ruminococcus sp. ERACg_42	Putative scaffoldin	Cohesin	Yes	23
Ruminococcus sp. ERACg_42	Putative scaffoldin	Cohesin_III	Yes	5
Ruminococcus sp. ERACg_42	Putative scaffoldin	Cohesin_I-dockerin_I	Yes	19
Ruminococcus sp. ERACg_42	Putative scaffoldin	Dockerin_I-Cthe_2159-Cthe_2159	Yes	14
Ruminococcus sp. ERACg_42	Putative scaffoldin	Dockerin_III-cohesin_III-Dockerin_I	Yes	5
Ruminococcus sp. ERACg_42	Putative scaffoldin C	No domain	Yes	2
Ruminococcus sp. ERACg_42	Putative scaffoldin	No domain	Yes	49
Ruminococcus sp. ERACg_42	Cellulosomal protein	Dockerin_l	Yes	4
Ruminococcus sp. ERACg_42	Cellulosomal protein	LRR_5-dockerin_I	Yes	19
Ruminococcus sp. ERACg_42	Cellulosomal protein	LRR_5-dockerin_I	Yes	1
Ruminococcus sp. ERACg_42	Cellulosomal protein	LRR_5-dockerin_I	Yes	6
Ruminococcus sp. ERACg_42	Cellulosomal protein	LRR_5-dockerin_I	Yes	2
Ruminococcus sp. ERACg_42	Cellulosomal protein	DUF4874-DUF4832-dockerin_I	Yes	1
Ruminococcus sp. ERACg_42	Peptidase	Dockerin_I-peptidase	Yes	1
Ruminococcus sp. ERACg_42	Cellulosomal protein	Dockerin_l	Yes	6
Bacteroides sp. ERACg_43	SusD family protein		No	1
Bacteroides sp. ERACg_43	Starch binding associated with outer membrane		No	1
Bacteroides sp. ERACg_43	TonB-linked outer membrane protein, SusC/RagA family		No	1
Bacteroides sp. ERACg_43	TonB-linked outer membrane protein, SusC/RagA family		No	1
Bacteroides sp. ERACg_43	TonB-linked outer membrane protein, SusC/RagA family		No	6
Bacteroides sp. ERACg_43	TonB-linked outer membrane protein, SusC/RagA family		No	1
Bacteroides sp. ERACg_43	SusD family protein		No	1
Bacteroides sp. ERACg_43	TonB-linked outer membrane protein, SusC/RagA family		No	6

## TABLE 3 Putative cellulosomal proteins and SusC/SusD families identified by LC-MS/MS from ERAC grown on sugarcane bagasse<sup>a</sup>

<sup>a</sup>Abbreviations: cohesin\_number, cohesin type number; dockerin\_number, dockerin type number; Cthe\_2159 represents a novel family of cellulose-binding beta-helix proteins from *Clostridium thermocellum*; LRR\_5, leucine-rich repeats; PUL, polysaccharide utilization loci. Cohesin and dockerin domains are represented with the family number according to their representation in the dbCAN database. The protein set secreted by enriched rumen anaerobic consortium (ERAC) is given in Data Set S3 in the supplemental material.

<sup>b</sup>Prediction of signal peptides based on SignalP analysis.

<sup>c</sup>Metaproteome analysis based on spectral counting.

Based on our taxonomic classification, ERACg\_42 belongs to the Ruminococcus genus. The classification was carried out based on two different methods, the use of marker genes (the Phyla-AMHORA classification [48]) and alignment of k-mers (Kraken classification [49]). Nonetheless, an additional phylogenomic analysis was performed to avoid unequivocal taxonomic classification and to reveal genomic features common to the Ruminococcus genus. This analysis is based on orthologous genes among the genomes of different species indicating rearrangements, deletions, and insertions in the chromosomes and determining the speciation process and its functional consequences (52). Using draft genomes of type strains of the genus Ruminococcus, a phylogenetic tree was reconstructed based on 304 concatenated orthologous proteins, illustrating the evolutionary distances among Ruminococcus species (Fig. S5). Ruminococcus ERACg 42 is closely related to R. flavefaciens ATCC 19208. Both genomes share 1,698 orthologous genes, representing 66.6% and 53.9% of all proteins predicted for Ruminococcus ERACg\_42 and R. flavefaciens ATCC 19208, respectively (Data Set S5). The coding sequences for cellular processes (e.g., extracellular structures, transporters, cell division) and nucleotide and carbohydrate metabolism are within the core set of genes.

The draft genome of *Ruminococcus* sp. ERACg\_42 encodes 72 GHs and at least 11 different loci bearing genes encoding cellulosomal structures. Among the 72 predicted GHs in *Ruminococcus* sp. ERACg\_42, 37 of them (50.7%) were from 17 distinct families and harbored type I dockerin modules, and several of them were also found in

				Secretion	Total spectrum
ERACg identifier	Predicted protein	Modular architecture	EC no.	signal <sup>6</sup>	count
Ruminococcus sp. ERACg_42	Endoglucanase	CBM79-CBM79-GH5_4	3.2.1.4	Yes	8
Ruminococcus sp. ERACg_42	Endoglucanase	GH5_1-dockerin_I	3.2.1.4	Yes	7
Ruminococcus sp. ERACg_42	Endoglucanase	GH5_1-dockerin_I	3.2.1.4	Yes	17
Ruminococcus sp. ERACg_42	Cellulase	GH9-CBM3-dockerin_l	3.2.1.4	Yes	14
Ruminococcus sp. ERACg_42	Cellulase:acetylxylan esterase	GH5_4-CBM22-CE3-dockerin_l	3.2.1.4, 3.1.1.72	Yes	7
Ruminococcus sp. ERACg_42	Cellulase	CBM4-CBM30-GH9-dockerin_l	3.2.1.4	Yes	2
Ruminococcus sp. ERACg_42	Cellulase	GH9-CBM3-dockerin_l	3.2.1.4	Yes	8
Ruminococcus sp. ERACg_42	Endoglucanase	GH9-CBM79-dockerin_l	3.2.1.4	Yes	39
Ruminococcus sp. ERACg_42	Cellulase	GH5_4-CBM80-dockerin_l	3.2.1.4	Yes	69
Ruminococcus sp. ERACg_42	Cellulase	GH9-CBM3-dockerin_l	3.2.1.4	Yes	8
Ruminococcus sp. ERACg_42	Cellulase	GH9-CBM3-dockerin_l	3.2.1.4	Yes	32
Ruminococcus sp. ERACg_42	Glycoside hydrolase family 44	GH44-CBM76-dockerin_I	Not determined	Yes	2
Ruminococcus sp. ERACg_42	Cellulase:acetylxylan esterase	GH5_4-CBM22-CE3-Dockerin_l	3.2.1.4, 3.1.1.72	Yes	7
Ruminococcus sp. ERACg_42	Mannan endo-1,4- $eta$ -mannosidase	CBM35-GH26-dockerin_l	3.2.1.78	Yes	-
Ruminococcus sp. ERACg_42	Xyloglucan-specific endo- $\beta$ -1,4-glucanase	GH5_4-CBM22-dockerin_l	3.2.1.151	Yes	14
Ruminococcus sp. ERACg_42	Glucuronoarabinoxylan endo-1,4- $\beta$ -xylanase;	GH5_4-CBM22-dockerin_l	3.2.1.136, 3.1.1.73	Yes	11
	feruloyl esterase				
Ruminococcus sp. ERACg_42	Endo-1,4- $eta$ -xylanase; feruloyl esterase	GH10-CBM22-CE1	3.2.1.8, 3.1.1.73	Yes	11
Ruminococcus sp. ERACg_42	Endo-1,4- $eta$ -xylanase; nonreducing end	CBM22-GH10-CBM22-dockerin_l-GH43-CBM36	3.2.1.8, 3.2.1.55	Yes	37
	lpha-L-arabinofuranosidase				
Ruminococcus sp. ERACg_42	Endo-1,4-β-xylanase	CBM22-GH10-dockerin_I	3.2.1.8	Yes	Э
Ruminococcus sp. ERACg_42	Endo-1,4- $eta$ -xylanase; feruloyl esterase	GH43_10-CBM22-dockerin_I-CE1	3.2.1.37, 3.1.1.73	Yes	15
Ruminococcus sp. ERACg_42	Xylan-1,4- <i>B</i> -xylosidase	GH43_29-CBM6-CBM22-dockerin_l	3.2.1.37	Yes	2
Ruminococcus sp. ERACg_42	Oligoxyloglucan reducing-end-specific	GH74-dockerin_l	3.2.1.150	Yes	12
	cellobiohydrolase				
Ruminococcus sp. ERACg_42	Endo- $eta$ -1,4-xylanase; chitin deacetylase	GH11-CBM22-dockerin_I-CBM22-CE4	3.2.1.8, 3.5.1.41	Yes	1
Ruminococcus sp. ERACg_42	Arabinan endo-1,5- $lpha$ -L-arabinosidase	GH43-CBM13-dockerin_l	3.2.1.99	Yes	12
Ruminococcus sp. ERACg_42	Mannan endo-1,4- $eta$ -mannosidase	CBM35-GH26-dockerin_I	3.2.1.78	Yes	1
Ruminococcus sp. ERACg_42	Acetylxylan esterase	Dockerin_I-CE2-CBM4	3.1.1.72	Yes	-
Ruminococcus sp. ERACg_42	Putative glycoside hydrolase family 141	GH141-CBM6-dockerin_l	Not determined	Yes	-
Ruminococcus sp. ERACg_42	eta-Galactosidase	GH2-dockerin_l	3.2.1.23	Yes	8
Ruminococcus sp. ERACg_42	Carbohydrate esterase family 12	CE12-CBM13-dockerin_I-CBM35-CE12	3.1.1.86	Yes	2
Ruminococcus sp. ERACg_42	Rhamnogalacturonan endolyase	PL11-dockerin_l	4.2.2.23	Yes	13
Ruminococcus sp. ERACg_42	Pectate lyase	PL1-PL9-dockerin_l	4.2.2.2; 4.2.2.9	Yes	S
Aminobacterium sp. ERACg_4	Glycoside hydrolase family 18	GH18	Not determined	Yes	1
<sup>a</sup> Abbreviations: ERAC, enriched rumen glycoside hydrolase; CBM, carbohydra	<sup>A</sup> bbreviations: ERAC, enriched rumen anaerobic consortium; ERACg, enriched rumen anaerobic cor glycoside hydrolase; CBM, carbohydrate-binding module; CE, carbohydrate esterases; PL, polysacch	Abbreviations: ERAC, enriched rumen anaerobic consortium; ERACg, enriched rumen anaerobic consortium genome; EC, Enzyme Commission; cohesin_number, cohesin type number; dockerin_number, dockerin_number, dockerin_number, dockerin_number, dockerin_type number, dockerin_number, dockerin_type number, dockerin_number, docker	cohesin type number; docker ith the family number accorc	rin_number, dockeri ding their represent	n type number; GH, ation in the CAZy

j aing database.

<sup>bp</sup>rediction of signal peptides based on SignalP analysis. <sup>c</sup>Metaproteome analysis based on spectral counting.

combination with CBMs (Table S10). These putative cellulosomal genes encode cellulases (GH5, GH9, and GH44), xylanases (GH10, GH11, GH30, and GH127), mannanases (GH26), and arabinogalactan endo- $\beta$ -1,4-galactanase (GH53). The proteins (37 GHs) encoded by the majority of these putative cellulosomal coding sequences show amino acid identity ranging from 34% to 82% with *R. flavefaciens* GHs. The proteins encoded by these genes were found to be appended to CBM76, CBM79, and CBM80, which so far have been found exclusively in ruminococcal species (53). We also found CEs and PLs appended to dockerin modules.

The analysis also indicated that *Ruminococcus* sp. ERACg\_42 is a producer of cellulosomes. Our analyses depicted 11 scaffoldin protein sequences, 10 of which represented putative scaffoldin proteins harboring type I or III cohesin modules (Table S9) with amino acid identities ranging from 30% to 85% compared to the *R. flavefaciens* sequences (Table S11). Three sequences encoded scaffoldins with dockerin modules, which may allow integration with additional scaffoldins and multiple enzymes to form the cellulosomal complex.

Besides the genomic prediction analysis, the ability of *Ruminococcus* ERACg\_42 to produce cellulosomes was supported by proteomic analysis. Among the proteins secreted by *Ruminococcus* ERACg\_42, 37 from 52 predicted cellulosomal proteins were detected, including 8 putative scaffoldins, 1 mixed cellulase-xylanase, 1  $\beta$ -lactosidase, 1 carboxylesterase, 2 pectinases, 11 cellulases, and 13 hemicellulases appended to dockerin modules (Tables 3 and 4; Tables S9 and S10), accounting for 521 of the total spectrum counts. Although the number of hemicellulases detected was slightly higher than the number of cellulases detected, the total spectrum counts for cellulases detected, the total spectrum counts for cellulases detected for hemicellulases (Table 4). Therefore, cellulosomes derived from *Ruminococcus* ERACg\_42 cells grown on sugarcane bagasse showed a profile that was predominantly cellulolytic, followed by hemicellulolytic and pectinolytic. Moreover, among the cellulases predicted from the *Ruminococcus* sp. ERACg\_42 draft genome, only endoglucanases were detected in the metaproteome.

The *Ruminococcus* type strains with ERACg\_42 harbored 30 different GH families involved in lignocellulosic degradation, while the closely related species *R. flavefaciens* ATCC 19208 encodes 28 GH families. The *Ruminococcus* strain harboring ERACg\_42 represents the third *Ruminococcus* species described to produce cellulosomes, since only *R. flavefaciens* ATCC 19208 and *R. champanellensis* JCM 17042 are known to produce cellulosomes (45, 49, 50).

## DISCUSSION

Some previous studies have reported the enrichment of microbial consortia using different carbon sources, inocula, and culture conditions (9, 19, 23–25, 28, 29, 31, 54). The resulting consortia are frequently described to have observed shifts in microbial communities in response to the carbon source used during the enrichment process. Even though these consortia have been shown to possess lignocellulolytic capabilities, genome-centric investigations and metaproteome analyses of these microbial communities have been barely exploited to date. Therefore, enriched microbial communities require a more comprehensive and deeper analysis of their genetic content and protein production capabilities, to provide novel insights into the syntrophic interaction among the lignocellulolytic members of the consortium.

To address this knowledge gap, we combined several approaches to exploit the lignocellulolytic capabilities of the ERAC. The consortium was established on sugarcane bagasse using as an inoculum source the rumen sample from a fistulated cow which was grazing on natural pastures. The first assessment of the lignocellulolytic capability of the ERAC indicated enzymatic activities against different polysaccharides, followed by modification on bagasse fibers, visualized by SEM. Based on these results, we combined taxonomic profiling, metagenomics, and metaproteomics approaches to evaluate the microbial structure and the enzymatic machinery associated with lignocellulose degradation present in the ERAC.

The 16S rRNA amplicon analyses showed that the diversity was significantly lower in

the ERAC than in the rumen inoculum sample (Fig. 3; see also Table S3 and Fig. S2 in the supplemental material). During the enrichment process, it has been observed that microorganisms with a metabolic function compatible with the cultivation conditions employed are selected and become dominant (9, 25, 26, 55–57). Decreasing diversity, for example, the consortium target for the degradation of quinoline (57), lignin (26), phenanthrene (55), and keratins (56), as well as the reduction of heavy metal (58), was also shown by other studies. Here, the ERAC was dominated by *Firmicutes* and *Bacteroidetes*, which are reported to be degraders of lignocellulosic biomass in several anaerobic environments, such as biogas reactors (59), landfill (60), and insect gut (9). Both phylogenetic groups are well-known to contain an extensive repertoire of CA-Zymes and enzymatic complexes (6, 7, 13).

For a deeper exploitation of the metagenome data, gene- and genome-centric metagenome analyses were carried out. The gene-centric analysis provided an overview of the entire metabolic potential of the ERAC. The resulting data identified a high proportion of genes associated with carbohydrate and amino acid metabolism (Fig. S3 and S4). These findings are consistent with the fact that the microbial community was enriched on lignocellulose biomass, where genes of carbohydrate metabolism should be highly abundant. Moreover, several conserved protein domain sequences related to lignin degradation were identified in this strictly anaerobic consortium. Although previous studies reported lignin degradation under anaerobic conditions (61–63), the mechanisms of decomposition are still poorly understood; thus, further analyses are required.

Based on genome-centric metagenome analysis, we were able to reconstruct 41 enriched rumen anaerobic consortium genomes (ERACgs) belonging to five phyla. The high level of completeness of the ERACgs allowed a detailed determination of potential degraders in this enriched anaerobic consortium as well as whether they harbor genes to produce enzymatic complexes. Among the ERACgs, those assigned to *Firmicutes* and *Bacteroidia* were predominant and harbored the highest number and diversity of CAZymes. Moreover, all *Bacteroidia* ERACgs and a *Clostridia* ERACg (ERACg\_42) were identified to be able to produce PULs and cellulosomes, respectively. Interestingly, ERACgs encoding PULs were identified to have genes encoding cellulolytic enzymes (from the GH5 and GH9 families). Although *Prevotella* species have been reported to use several polysaccharides as sole carbon sources (64, 65), there is no experimental evidence of cellulose depolymerization by PULs (66).

According to our phylogenetic analysis, the isolate with ERACg\_42 can confidently be assigned as a species of the Ruminococcus genus, closely related to R. flavefaciens ATCC 1920. ERACg\_42 encodes a repertoire of cellulosomal proteins and enzymes appended to dockerin modules, making the strain with this genome a potential cellulosome producer. The Ruminococcus ERACg\_42, however, possesses scaffoldin proteins with the lowest identity to protein sequences available in the public database. We also carried out additional sequence analysis in an attempt to classify the scaffoldins according to the terminology proposed by Brás et al. (67). However, as the scaffoldin sequences of Ruminococcus sp. ERACg\_42 share a low degree of identity with the corresponding homologous sequences of R. flavefaciens ATCC 19208 (Table S11), it was not possible to confidently classify scaffoldins from Ruminococcus sp. ERACg\_42. Further experimental investigation must be carried out to determine their classification. Furthermore, differently from the R. flavefaciens ATCC 19208 cellulosomes, which are mostly composed of type III dockerin- and cohesincontaining proteins (68, 69), Ruminococcus sp. ERACg\_42 encodes the majority of the cellulosomal proteins and CAZymes appended to type I dockerin and cohesin proteins. The type I and type II cohesin modules are frequently found in C. thermocellum and other cellulosome-producing clostridia (44, 49, 70, 71). The unconventional arrangements of the types of cohesin-dockerin modules, which have not been previously reported in this phylotype, in addition to unclassified scaffoldins, might represent novel architectural and functional aspects of cellulosomes.

In this study, *Firmicutes* and *Bacteroidetes* ERACgs were abundantly identified, and these organisms might be the major players responsible for synergistically acting to

degrade sugarcane bagasse in this anaerobic consortium. Indeed, metaproteome analysis detected several cellulosomal proteins and a diverse set of CAZymes secreted by the *Ruminococcus* ERACg\_42, including the production of cellulosomes with structures similar to those reported previously (49, 53, 69). Components of PULs (*Bacteroidetes*), such as SusCD proteins, were also detected, suggesting that another type of enzymatic complex is also produced.

Our multi-omics study disclosed secreted CAZymes, cellulosomes, PULs, and several nearly complete genomes from anaerobic lignocellulolytic microbes. The ERAC harbored the highest number of CAZymes when the number was compared to the number found in previously characterized anaerobic consortia (23) (Table S12). Compared to three other composting-derived consortium studies established under static conditions (19, 24, 72), the ERAC is the second in terms of total CAZyme number (Table S12). The ERAC also presented the second highest diversity of families in the CAZy database (Table S13) compared to that found in similar previous studies (6, 19, 24, 72). The apple pomace-adapted compost microbial community (72) mapped 13 additional families in the CAZy database (and two GH other families) compared to ERAC. However, the former study (72) examined 64% more protein-coding sequences than the present study (Table S13).

In conclusion, the integrative analysis incorporating metagenomic and metaproteomic approaches reported here has been shown to be a practical guide and a powerful strategy. This discovery approach extends the number of novel CAZymes, enzymatic complexes, and the respective microorganisms producing them, representing results beyond the current knowledge from the enrichment process. The vast and diverse reservoir of new CAZyme sequences discovered here opens up further avenues of opportunity, such as biochemical and structural studies of novel lignocellulolytic enzyme candidates. In addition, the enzymatic complexes reported here are composed of new sequences and may be applied to design artificial enzymatic complexes for future biotechnological applications.

#### **MATERIALS AND METHODS**

**Rumen-derived anaerobic consortium design.** An ERAC was established using cow rumen samples and sugarcane bagasse (SB) (see Table S14 in the supplemental material) as microbial and carbon sources, respectively. Fresh rumen samples (approximately 20 g) were taken from a fistulated cow which was grazing on natural pastures prior to the experimental period at the farm of the Department of Ruminants at the Luiz de Queiroz College of Agriculture (ESALQ/USP, Piracicaba, Brazil). Subsequently, the samples were immediately placed into a prewarmed thermos flask as a means to transport them to the laboratory. The rumen samples were kindly provided by the Department of Ruminants at the Luiz de Queiroz College of Agriculture (ESALQ/USP, Piracicaba, Brazil). All procedures related to animal experiments were undertaken following the guidelines of the Committee on Ethics in the Use of Animals (CEUA) of the Luiz de Queiroz College of Agriculture.

The rumen content was homogenized and mixed (1:4) with prewarmed anaerobic McDougall buffer (39°C) (73) inside an anaerobic chamber (Whitley DG250 anaerobic workstation) under 10% H<sub>2</sub>, 5% CO<sub>2</sub>, and 85% N<sub>2</sub>. Aliquots (2 ml) from mixed solutions were inoculated into 100-ml serum bottles containing 48 ml of growth medium supplemented with 500 mg of sterilized SB, which had previously been wrapped in aluminum foil and sterilized by autoclaving. Then, aliquots (1 ml) of the microbial suspension were transferred under strict anaerobic conditions to fresh medium every 5 days for 25 consecutive passages. The growth medium was prepared as described previously (72). Briefly, the medium was deoxygenated by gassing CO<sub>2</sub> and dispensed anaerobically in serum bottles inside an anaerobic chamber. The bottles were closed with a stopper, sealed, and autoclaved. Aliquots of 500 mg sterilized SB were added to the bottles, and the bottles were then reclosed and incubated under anoxic conditions.

**Total microbial DNA isolation.** Microbial DNA was extracted from the anaerobic consortium as described previously (74), with modifications. Briefly, an aliquot of a biological replicate from the ERAC culture was centrifuged at 12,000 × *g* for 20 min at 4°C. The resulting pellet was suspended in lysis buffer (100 mM EDTA, 50 mM NaCl, 10 mM Tris, pH 8, 1% SDS, proteinase K). The mixture was incubated at  $37^{\circ}$ C for 1 h with shaking. To ensure cell lysis, a bead-beating step was carried out using Lysing Matrix E tubes (MP Biomedicals), followed by incubation in a water bath at 65°C for 2 h. After centrifugation, the supernatant was mixed with an equal volume of chloroform-isoamyl alcohol (24:1, vol/vol). The solution was centrifuged, and the aqueous phase was transferred to a clean tube and treated with RNase A (Qiagen, Germantown, MD, USA) for 15 min at 37°C. The DNA was precipitated with isopropanol and resuspended in TE buffer (10 mM Tris-HCl, 1 mM EDTA, pH 8.0). The DNA solution was purified using Power Clean DNA clean-up kits (Mo Bio Laboratories) for the following applications.

**Library preparation.** The V4 region of the 16S rRNA gene was amplified using universal primers (primers 515F and 806R), which cover the *Bacteria* and *Archaea* domains (75). The PCR products obtained were purified with magnetic beads (Beckman Coulter), and the second reaction was carried out on these products to attach multiplex identified (MID) tags between Illumina adapter sequences. The 16S rRNA gene amplicons generated were purified and analyzed using magnetic beads and an Agilent 2100 bioanalyzer system (Agilent), respectively. The purified amplicons were quantified by Kapa Biosystems quantitative PCR (qPCR) library quantification and pooled in equimolar concentrations. The amplicon libraries were constructed in three biological replicates and sequenced on an Illumina MiSeq system ( $2 \times 150$  bp), applying the paired-end protocol according to standard procedures.

For metagenomic sequencing purposes, a library was constructed, using a NEBNext Ultra II DNA library preparation kit, by Illumina (New England Biolabs, USA), according to the manufacturer's instructions. The prepared library was validated and quantified using the Agilent bioanalyzer 2100 system with a 12000 DNA assay kit (Agilent) and a Kapa Biosystems next-generation sequencing library qPCR kit (Kapa Biosystems), respectively. Sequencing was performed using an Illumina HiSeq 2500 platform and applying the paired-end protocol ( $2 \times 150$ -bp paired ends).

Sequence data processing and statistical analysis. The raw 16S rRNA amplicon sequences were preprocessed using a Trimmomatic sequence trimmer (76) to remove the sequencing adapters, low-quality reads (average quality score < 33), and reads with ambiguous bases. Quality-filtered reads were merged by the fast length adjustment of short reads (FLASH) (77) with at least 40 bp of overlap. The unassembled reads were discarded during the merge step. Subsequently, the sequences were analyzed using the QIIME program according to established guidelines reported by Bokulich et al. (78). Briefly, the sequences were compared against the sequences in the Greengenes reference database (79) using the USEARCH program (usearch61 method) to detect chimeric sequences, which were removed. The sequences were clustered into operational taxonomic units (OTUs) using the USEARCH program with a similarity threshold of 97%. Representative sequences of each OTU were aligned by the PyNAST program against the reference database for taxonomic classification via the UCLUST program (EDGAR platform, 2010). To reduce the spurious OTUs, low-abundance OTUs (<0.01% of the sequences) were discarded. The microbial diversity (Shannon and Simpson metrics) and richness (ACE and Chao1 estimators) were calculated in QIIME.

Raw shotgun sequencing data were quality filtered to remove the adapters and reads with a low average quality score as described above. The quality-filtered reads were assembled using the MEGAHIT (v.1.1.1) program (80) with the default settings. The resulting reads were mapped onto the assembled contigs with the Bowtie 2 program (81) to estimate the inclusivity of the metagenome assembly. Analysis of the alignment statistics was performed by the use of SAMtools, which converts the sequence alignment map (SAM) into a binary alignment map (BAM) file and then sorts it. The MetaBAT program (82) was used for the binning process in its very specific mode. Completeness results shown in Table 2 represent the BUSCO 3.0.2 output (92). The completeness and contamination were estimated based on marker genes using the taxonomic workflow of the CheckM (v.1.0.7) program (42). For taxonomic binning, only binned contigs with a completeness of greater than 60% and contamination of less than 10% were assigned to the taxonomic rank using the Phyla-AMPHORA (83) and Kraken (84) tools. Finally, binned contigs was carried out within the EDGAR platform with the standard settings (52).

**CAZyme, cellulosomal proteins, and PUL prediction.** Searches for CAZymes, scaffolding proteins, and *susCD* gene pairs were performed as previously described (7, 86). Briefly, the amino acid sequences were compared to the sequences in the dbCAN-fam-HMMs database (32), based on hidden Markov models (HMMs), using the HMMER software package (87). The parameters were applied as follows: hits with E values of 1e–6 or not covering 30% of the respective HMM were removed. Predicted sequences in the CAZy database using the BLASTp program to determine the percent amino acid sequence identity against those sequences already reported, as described previously (6, 7, 22). To identify potential cellulosomal proteins and PUL, a model cohesin (PF00963), dockerin (PF00404), and SusD-like protein (PF07980) and a model for TonB-dependent receptor/SusC-like proteins (NtgR40456) were downloaded from the Pfam database (https://pfam.xfam.org) and the TIGR-fam database (http://www.tigr.org/TIGRFAMs), respectively, to extend the dbCAN-fam-HMMs database. For PUL prediction, we manually searched for CAZymes predicted within a range of five protein predictions upstream and downstream. The PUL diagrams were drawn using an in-house Python script.

Liquid chromatography (LC)-MS/MS analysis for metaproteome analysis. The protein concentration from the supernatant, which was obtained as described previously, was measured using the Bio-Rad protein assay reagent (Bio-Rad Laboratories) according to the Bradford method (88). Bovine serum albumin was used as a standard. Aliquots of  $12 \mu g$  from the concentrated supernatants were subjected in duplicate to SDS-PAGE using a 12% polyacrylamide gel at 100 V for 1.5 h. The gel was stained by incubating with Coomassie brilliant blue G-250 solution for 3 h on a platform with gentle shaking at room temperature. The gel lanes were cut manually into 12 slices, which were distained with 50% (vol/vol) methanol and 2.5% (vol/vol) acetic acid for 2 h and then dehydrated using acetonitrile. Subsequently, the bands were reduced and alkylated with 10 MM dithiothreitol (DTT) and 50 mM iodoacetamide solutions, respectively, and were then washed with ammonium bicarbonate (for 10 min) and dehydrated using acetonitrile and sodium bicarbonate, respectively. The proteins embedded in the gel slices were digested with trypsin (Promega Corp., Madison, WI, USA), dissolved in 100 mM ammonium bicarbonate solution, and incubated at  $37^{\circ}$ C overnight. The resulting peptides were purified and desalted using self-assembled C<sub>18</sub> stage tips. The eluted peptides were analyzed on an

electron transfer dissociation (ETD)-enabled LTQ Velos Orbitrap mass spectrometer (Thermo Fisher Scientific) coupled with a liquid chromatograph-tandem mass spectrometer (EASY-nLC system; Proxeon Biosystems) through a Proxeon nanoelectrospray ion source. The peptides were separated with 2% to 90% (vol/vol) acetonitrile in 0.1% (vol/vol) formic acid at 0.6  $\mu$ l/min using a PicoFrit analytical column (20 cm by 75  $\mu$ m [inside diameter]; particle size, 5  $\mu$ m; New Objective, Woburn, MA) at a flow rate of 300 nl/min over 27 min. The nanoelectrospray voltage was set to 2.2 kV, and the source temperature was 275°C. The instrument method for the LTQ Velos Orbitrap mass spectrometer was set up in the data-dependent acquisition mode. The full-scan MS spectra (m/z 300 to 1,600) were acquired in the Orbitrap mass spectrometer was set to a target value of  $1 \times 10^6$ . The resolution in the Orbitrap mass spectrometer was set to a target value of 5,000 and fragmented in the linear ion trap by low-energy collision-induced dissociation (CID) (normalized collision energy, 35%). The signal threshold for triggering an MS/MS event was set to 1,000 counts. Dynamic exclusion was enabled with an exclusion size list of 500, an exclusion duration of 60 s, and a repeat count of 1. An activation false-discovery rate (FDR; q value) of 0.25 and an activation time of 10 ms were used.

**Metaproteome analysis.** The raw data were converted into a peak list format (.mgf) using the Mascot server (Matrix Science Ltd.). The resulting peaks were searched against the predicted protein sequences from the ERAC metagenome using the Mascot server (Matrix Science). The following search criteria were applied: carbamidomethylation as fixed modifications, oxidation of methionine as a variable modification, one missed trypsin cleavage, and a tolerance of 10 ppm for precursor ions and 1 Da for fragment ions. ScaffoldQ+ software was applied to further analyze the data processed by the Mascot server to validate the MS/MS-based peptide and protein identification. The following parameters were applied: a minimum protein probability of 90%, a minimum peptide probability of 50%, and a unique different minimum peptide of 2. The false-discovery rate (FDR) was adjusted to 1%. Protein quantification was based on the normalized spectrum abundance, which was calculated as the number of spectral counts identifying a protein. The presence of signal peptides and subcellular localization were manually assessed using the signal peptide prediction program SignalP (v.4.0) (89) and the TMHMM (v.2.0) server (90), respectively.

**Enzymatic activity assays.** Enzymatic activity was determined by measuring the amount of reducing sugar released from distinct polysaccharides, including xylan, lichenan,  $\beta$ -glucan, rye arabinoxylan, xyloglucan, rhamnogalacturonan, pectin, mannan and carboxymethyl cellulose sodium salt (CMC). The polysaccharides were purchased from Sigma-Aldrich and Megazyme. All assays were performed using the proteins at a concentration of 100 ng/ $\mu$ l. The enzymatic reactions were performed in a miniaturized fashion by mixing 100  $\mu$ l of concentrated supernatant, 50  $\mu$ l of substrate solution (0.5%, wt/vol), and 30  $\mu$ l of sodium phosphate buffer (0.1 M) at pH 5.5 and incubation at 39°C for 15 min. The reactions were stopped by adding 100  $\mu$ l of 3,5-dinitrosalicylic acid (DNS), and the mixture was then immediately boiled for 5 min at 99°C (91). The color intensities were measured in an Infinite M200 spectrophotometer (Tecan, Switzerland) at 540 nm. The calibration curves were constructed using glucose, xylose, and mannose as standards. One unit of enzymatic activity corresponds to the amount of enzyme required to release 1  $\mu$ mol of reducing sugar per minute. All enzymatic activity assays were carried out in biological triplicate.

**Scanning electron microscopy.** The morphology of the sugarcane bagasse samples before and after being used as a carbon source by the anaerobic consortium was examined using scanning electron microscopy (SEM). Samples were mounted over the metal support (stub) with double-sided carbon tape, and a thin layer of gold metal was applied using an automated sputter coater (Bal-Tec, Walluf, Germany) for 1 min. Then, the samples were examined using an FEI Quanta 650 scanning electron microscope (Thermo Fisher Scientific) operating with a 5-kV accelerating voltage. Several images per samples were obtained from different areas to build up two-image databases (for no bagasse degraded and bagasse degraded).

**GC-MS.** The gases produced by the anaerobic microbial consortium were determined in a gas chromatograph (GC 2014 model; Shimadzu) equipped with a thermal conductivity detector (TCD) and a packed column (Shincarbon ST 50/80 mesh). The injector and detector temperatures were set to 200°C. Initially, the temperature of the GC column was 50°C for 3 min, and then it was heated stepwise (5°C/min) until it reached 180°C. Aliquots of 0.5 ml were recovered from the headspace of the serum bottle and injected using nitrogen as the carrier gas.

**Data availability.** The raw sequencing reads of the amplicon, metagenome, and metaproteome were deposited in the GenBank and PRIDE databases under accession numbers PRJEB30762 and PXD019219, respectively. The data sets supporting the conclusions of this article will be provided upon request.

#### SUPPLEMENTAL MATERIAL

Supplemental material is available online only. SUPPLEMENTAL FILE 1, PDF file, 2.6 MB. SUPPLEMENTAL FILE 2, XLSX file, 0.03 MB. SUPPLEMENTAL FILE 3, XLSX file, 0.02 MB. SUPPLEMENTAL FILE 4, XLSX file, 0.04 MB. SUPPLEMENTAL FILE 5, XLSX file, 0.04 MB. SUPPLEMENTAL FILE 6, XLSX file, 0.1 MB.

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We declare no conflict of interest.

G.T. and F.M.S. conceived of and designed the project. G.T. carried out all the experiments and data processing and interpretation and drafted the manuscript. A.C.P. contributed to the experiments. G.T. and D.W. performed the processing of the data. N.D. contributed reagents, materials, and analyses and revised the manuscript. F.M.S. directed the overall study and drafted and revised the manuscript. All authors read and agreed with the submitted version of the paper.

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