

Lebanese fermented goat milk products: From tradition to meta-omics

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► To cite this version:

I. Ammoun, C.I. Kothe, N. Mohellibi, Catherine Béal, R. Yaacoub, et al.. Lebanese fermented goat milk products: From tradition to meta-omics. Food Research International, 2023, 168, pp. 112762. 10.1016/j.foodres.2023.112762 . hal-04057222

HAL Id: hal-04057222 https://hal.science/hal-04057222

Submitted on 11 Oct 2023

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15	Highlights
16 17	- Detailed analysis of the production chain of three emblematic Lebanese fermented goat milk products
18	- Ambriss and Serdaleh have a microbiota composition similar to that of kefir
19 20	- Adaptation of the zoonotic agent <i>Streptococcus parasuis</i> to milk fermentation through the acquisition of lactose utilization genes
21	- Evidence of herd infection by Mycoplasmopsis agalactiae through MAG analysis
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26 1 Abstract

27 Ambriss, Serdaleh and Labneh El Darff are traditional Lebanese products made from fermented goat's milk from the Bekaa Valley, the Chouf Mountains and Southern Lebanon, 28 29 respectively. A questionnaire completed by 50 producers of these products showed that they are 30 prepared by periodic percolation either by milk or by Laban in amphorae or goatskins during the 31 lactation season. Production is carried out on a small scale and in a limited number of production 32 units, often by elderly people, resulting in a real risk of disappearance of these products and loss 33 of the corresponding microbial resources will be lost. In this study, 34 samples from 18 34 producers were characterized by culture-dependent and -independent analyses. The results 35 obtained by these two methods were radically different, especially for Ambriss and Serdaleh, the 36 latter revealing the co-dominance of Lactobacillus kefiranofaciens, a fastidious-growing species, 37 and Lactococcus lactis in a viable but not culturable state. Overall, their composition is reminiscent of kefir grains. However, phylogenomic and functional analyses of the genomes of 38 39 the key species Lb. kefiranofaciens show that they differed from those of kefir, for example in 40 their polysaccharide genes, explaining the absence of grains. Labneh El Darff displays a 41 dominance of Lactobacillus delbrueckii, probably due to the addition of Laban. In addition, 42 several zoonotic pathogens were found, including Streptococcus parasuis, which was dominant 43 in one sample and which MAG analysis revealed it acquired lactose utilization genes through 44 horizontal gene transfer. The contamination of the herd with Mycoplasmopsis agalactiae in the 45 Chouf region was also revealed by MAG analysis of the Serdaleh samples. Antibiotic resistance 46 genes were detected in most of the samples, particularly in the Serdaleh samples, where the 47 dominant L. lactis strains possessed a plasmid with a multi-resistance island. Finally, this study 48 paves the way for further analyses to shed light on the resilience of these ecosystems established 49 in amphora or in goatskins and to improve hygiene practices for milk production.

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Keywords: Microbial diversity, kefir, metagenomics, genomics, ecology, VBNC, metagenome assembled genomes, LAB, *Lactobacillus kefiranofaciens*, *Streptococcus parasuis*,
 Mycoplasmopsis agalactiae

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55 2 Introduction

56 The Mediterranean region is well known for its goat farming, providing about 21% of the 57 world's goat milk supply (Miller & Lu, 2019; Dubeuf et al., 2016). Due to the nature of its 58 composition, organoleptic characteristics and healthy attributes, goat milk has been the focus of 59 interest in recent years (Prosser, 2021; Clark and Mora García, 2017). This sector has received 60 increasing attention, particularly in Lebanon, and continues to grow (Kayouli, 2015). Goat milk 61 products are highly appreciated by local consumers (Balaa & Marie, 2008), especially for their 62 specific "goaty taste" (Semaan et al., 2011). Compared to cow milk, its casein proteins are more easily digested and it is better tolerated by people with mild lactose intolerance. It has a higher 63 64 content of short-chain fatty acids in milk fat (Shu et al., 2016; Zenebe et al., 2014) and contains 65 minerals such as magnesium, calcium and phosphorus (Abbas et al., 2014).

66 These goat milk products are made either from standardized milk at the industrial scale, such as Laban (Chammas et al., 2006a), Labneh (Serhan et al., 2016), Shankleesh (Serhan & 67 Mattar, 2013: Toufeili et al., 1995), Kishk (Salameh et al., 2016), or artisanally from raw milk, 68 such as Darfiyeh (Hosri & El Khoury, 2004), Aricheh (Serhan & Mattar, 2013), Serdaleh (Tabet 69 70 et al., 2019), Ambriss (Dimassi et al., 2020) and Labneh El Darff (Semaan et al., 2011). The 71 diversity of these dairy products not only enriches the Lebanese culinary culture and pantry 72 (Massaad, 2017), but also represents an important source of empowerment for women in poor 73 rural areas. Female-headed households effectively contribute to the development of the goat 74 rearing sector and the manufacturing of goat milk products (Kayouli, 2015). The market share of 75 this sector is not well characterized; however, 70% of all small ruminant industries are located in 76 rural areas with limited market access (Saadeh, 2016). Among these fermented goat milk 77 products, Ambriss, Serdaleh and Labneh El Darff, made with milk from the Black Baladi race 78 that grazes in the Bekaa Valley, the Chouf Mountains and Southern Lebanon, respectively 79 (Figure 1A), are real candidates to be awarded the PGI (Protected Geographical Origin) label 80 according to the report of the SRVA (Service Romand de Vulgarisation Agricole; IDEAS 81 Centre, 2005; Ministère de l'Economie et du Commerce de la République Libanaise, 2006). 82 However, it appears that these products are in danger of disappearing, mainly due to commercial, 83 regulatory and food safety concerns (Serhan & Mattar, 2018; Semaan et al., 2011). In fact, these 84 products are made on a seasonal basis, at small or medium production scales and according to 85 traditional methods (Figure 1B), by successive fermentation of raw goat milk in amphorae for 86 Ambriss (Dimassi et al. 2020) and Serdaleh (Serhan and Mattar, 2013) and Laban in goatskins

87 for Labneh El Darff (Serhan et al. 2016; Nasbimana et al. 2005).

88 In the Mediterranean region, traditional fermented milk products are closely related to the 89 area in which they are produced and the cultural history and heritage (Boyazoglu & Morand-90 Fehr, 2001). This fact has drawn the attention of many studies due to the unique microbial 91 diversity of these products (Rhaiem et al., 2016; Abdalla & Hussain, 2010; Ayad et al., 2004; El Soda et al., 2003). Numerous genera of lactic acid bacteria (LAB) such as Lactobacillus, 92 93 Lactococcus, Enterococcus, Leuconostoc and Streptococcus are generally involved in these 94 transformations. However, only a few studies have described the native microbiota in the 95 Lebanese fermented milk products, and the characterization of the isolates has been restricted to 96 phenotypic and biochemical analyses. The first attempts were recorded on Laban, where 96 97 strains of S. thermophilus and L. bulgaricus were characterized (Chammas et al., 2006b). Serhan 98 et al. (2009) then revealed the presence of the LAB Streptococcus thermophilus, Enterococcus 99 spp., Lactococcus lactis subsp. lactis and cremoris, Lactiplantibacillus plantarum, Lactobacillus 100 *curvatus* in Darfiyeh cheese using culture-dependent methods. Moreover, Dib et al. (2012) 101 isolated 25 different strains in Serdaleh, Laban and Darfiveh cheese belonging to the species Lp. plantarum, Lacticaseibacillus paracasei, 102 Lacticaseibacillus casei and Leuconostoc 103 mesenteroides

104 Until now, these traditional Lebanese products have only been characterized using 105 cultural methods, which provide a patchy view of the microbiota, whereas new methods for characterizing food ecosystems are now available, based on techniques such as 16S and shotgun 106 107 metagenomic analyses (Walsh et al., 2022). Approaches based on these techniques have already 108 been used in a study on traditional Brazilian cheeses and provided a global picture of their 109 microbiota, with taxonomic resolution close to the strain level for dominant populations and 110 functional data at the gene level (Kothe et al., 2021). We therefore decided to develop a better 111 understanding of the microbiota of Ambriss, Serdaleh and Labneh El Darff using these new 112 methods to improve our knowledge of their processes, and to thus develop strategies to preserve them and boost their development. To do this, 34 samples of fermented goat milk products from 113 18 producers were characterized using a combination of culture-dependent and culture-114 independent analyses, including genomic analyses of isolated strains and metagenomic 115 116 assemblies, as well as functional analyses based on deep metagenomic profiling. The results 117 were interpreted with regard to the manufacturing processes and physico-chemical characteristics 118 of the products.

119 **3** Materials and Methods

120 3.1 Development of a producer's survey

121 A producers' survey was conducted over 50 breeders or producers from the three selected 122 production regions – the Bekaa Valley, the Chouf Mountains and Southern Lebanon – for the 123 artisanal products of Ambriss, Serdaleh and Labneh El Darff, respectively. The questionnaire 124 consisted of 34 questions (Supplementary datafile 1), covering three main areas: (i) socio-125 demographic aspects; (ii) breeding activities; and (iii) production activities, including 126 commercialization. The questions included general and socio-economic information about 127 producers, information regarding livestock size, goat breed, breeding type and practices, milk 128 production volumes, as well as the type of dairy product produced, the production season, the 129 raw materials used, production volumes, prices and marketing practices. In addition, a detailed 130 observation of the processing was carried out in order to build a common production flow chart 131 for each product type, showing the existing differences between the producers as well.

132 3.2 Sample collection, physic-chemical and microbiological analyses

Producers were first selected on the basis of the survey at the different production sites according to two main criteria: their production was small-scale and they had been producing their product for more than 15 years. In total, 34 artisanal samples from 18 producers were collected during two consecutive production seasons in 2018 and 2019 (**Table S1**).

Samples of fermented goat milk products (10 g) were taken aseptically and homogenized for 60 s in a laboratory blender (Blender LB20E, Waring, Torrington, CT, USA) with 90 mL and 20 mL of distilled water, for pH and salinity tests, respectively. The pH was measured using a digital pH meter (GLP 21, Crison instrument, Barcelona, Spain). The salinity content was determined using chloride test strips (30-600 mg/L; QuanTabTitrator, Hach, Loveland, CO, USA). All measurements were performed in triplicate. Samples were preserved in phosphatebuffered saline (PBS 15X, pH 8.7), and stored at -20°C for further analysis.

For culture-dependent analyses, samples were diluted and homogenized in buffer peptone water (2%). They were spread in triplicate on MRS (pH 6.2, Sigma-Aldrich, St. Louis, MO, USA) and M17 (pH 6.5, Sigma-Aldrich, St. Louis, MO, USA) agar plates. Plates were incubated for 48 h, anaerobically for MRS at 30°C and 42°C to allow mesophilic and thermophilic *Lactobacillus* counts, respectively, and aerobically for M17 at 30°C for lactococci. Specific procedures were applied to isolate *L. lactis* and *Lactobacillus kefiranofaciens* strains. Culture media were supplemented with 2% salt and 10% goat milk for *L. lactis*, or with 25% goat milk and adjusted at pH 5.3 for *Lb. kefiranofaciens*, and incubated anaerobically at 30°C for 10 days.

Based on their distinct morphology (shape, color and size), colonies were selected and purified by repetitive streaking on the same medium. Isolates were assessed for their catalase activity and Gram coloration according to the criteria described by Kandler and Weiss (1986), as well as for their ability to produce gas from glucose by inverted tubes (Zúñiga et al., 1993). Biochemical identification and carbohydrate fermentation patterns were determined by API 50 CH and API 20 STREP test kits (BioMérieux Inc., Marcy l'Etoile, France) following the manufacturer's recommendations.

160 In order to identify the different morphotypes, isolates were suspended in 400 µL Tris-161 EDTA (TE 1X, pH 8.0) buffer in a 2-mL tube. DNAs was lysed using a bead-beater (24 162 Microtubes BeadBlaster, Thomas Scientific, NJ., USA), with 100 mg zirconium beads of 0.1 and 163 0.5-mm diameters and homogenized for 20 s at 4.5 m/s. Once extracted, amplification of the 164 coding gene for 16S rRNA was carried out for 30 cycles on a final mix of 25 µL containing the 165 following universal primers: Bact-27F (5'-AGAGTTTGATCCTGGCTCAG-3') and 1492R (5'-166 GGTTACCTTGTTACGACTT-3)', using Taqara DNA Taq polymerase (Almeida et al., 2014). 167 Products were purified using a purification kit (Gen Elute PCR clean up, Sigma, St. Louis, MO, 168 USA). Genotypic identification was carried out by blasting the different sequences of the isolated 169 strains using the NCBI database.

170 3.3 Genomic DNA extraction and sequencing

171 DNA from five isolates, chosen as representative of the main species detected in our 172 products, was extracted from the bacterial cells according to the protocol described by Kothe et 173 al. (2021). DNA sequencing was carried out on an Illumina HiSeq at GATC-Biotech (Konstanz, 174 Germany) to generate about 5-6 million paired-end reads (150 bases in length). For each strain, 175 the paired-end reads were merged and *de novo* assembly was performed using SPAdes 3.9 176 (Bankevich et al., 2012). Only contigs with length > 300 bp and coverage > 100 were considered 177 for further study. Annotations were performed with Rapid Annotation using the Subsystem 178 Technology server (Aziz et al., 2012).

179 3.4 DNA extraction from the products

180 Samples (0.5 g) were diluted 1:1 (w/v) in guanidinium thiocyanate 4M solution (Sigma-181 Aldrich, MO, USA) with TrisHCl 0.1M and processed in the same way as for the isolate DNA 182 extraction. The mixture was then supplemented with 10% N-Lauryl sarcosine (Sigma-Aldrich, 183 MO, USA), vortexed and centrifuged at 4°C and 14,000 g for 30 min. Supernatant were 184 discarded and extraction was continued on the emerged pellet, as described by Almeida et al. 185 (2014). DNA was visually evaluated on 0.8% agarose gel and quantified by a fluorometer (Oubit 186 2.0, ThermoFisher Scientific) supplied with the Qubit dsDNA HS Assay Kit (ThermoFisher 187 Scientific).

188 3.5 Metagenetic analysis

189 Bacterial diversity was analyzed by sequencing the amplified region V3-V4 of the 16S rRNA gene using primers V3F and V4R (V3F: 5'-CCTACGGGAGGCAGCAG-3'/ V4R: 5'-190 191 GGACTACHVGGGTWTCTAAT-3'). The PCR was performed with MTP Taq DNA 192 Polymerase (Sigma-Aldrich, St. Louis, MO, USA), and cycling conditions were: 94°C for 1 min, 193 followed by 30 cycles of amplification at 94°C for 1 min, 65°C for 1 min, and 72°C for 1 min, 194 with a final extension step of 10 min at 72°C. Sequencing was performed with the V3 Illumina 195 MiSeq kit, as described in Poirier et al. (2018), and fasta files were generated at the end of the 196 run (MiSeq Reporter software, Illumina, USA).

197 The quality of the raw data was evaluated with FastQC (Wingett & Andrews, 2018) and 198 the sequences were imported into the FROGS (Find Rapidly OTUs with Galaxy Solution) 199 pipeline (Escudié et al., 2018) to obtain the Operational Taxonomic Units (OTUs). The 200 sequences were filtered by length (480-580 bp) and then pooled into OTUs with SWARM (Mahé 201 et al., 2014) with the distance parameter of 1. Chimeras were removed with VSEARCH (Rognes 202 et al., 2016) and OTUs with at least 0.005% in the whole dataset were retained (Bokulich et al., 203 2013). OTUs were affiliated with the 16S SILVA 138.1 database (Quast et al., 2013). Alpha-204 diversity and beta-diversity analyses were performed with R Studio v.3.6.1 using the phyloseq 205 and ggplot2 packages (v1.30.0). Statistics were performed on alpha-diversity using Kruskal-206 Wallis and linear model regression. DESeq2 was applied to characterize statistically significant 207 differentially abundant OTUs in the different products (Love et al., 2014). The PCoA was plotted 208 with the ward.D2 method and Permanova tests were performed between samples.

209 3.6 Taxonomic composition by shotgun metagenomics study

210 Sixteen fermented products (six Ambriss, six Serdaleh and four Labneh) were selected on 211 the basis of the metagenetic results for more in-depth analysis. The metagenomic DNA was 212 sequenced using Illumina HiSeq2500 technology at GATC-Biotech (Konstanz, Germany). 213 Metagenomic reads corresponding to the Capra hircus genome were filtered out by reads 214 mapping against the Capra hircus reference genome (LWLT00000000) using Bowtie2 215 (Langmead & Salzberg, 2012). The proportion of goat reads in the samples was then assessed using samtools flagstat (Li et al., 2009). On the basis of the fastq file generated after host read 216 217 filtration, we first estimated microbial composition by mapping the samples. Reads were mapped 218 against the representative clade-specific marker catalogue contained in the MetaPhlAn tool v. 219 3.0.4 (Truong et al., 2015).

In addition, we performed taxonomic profiling using an assembly-based marker gene analysis, which allows non-supervised binning of metagenomes using metaSPAdes v.3.9 (Bankevich et al., 2012). Genes were then predicted using Prodigal (v.2.6.3) and marker genes were extracted using fetchMG, v.1.0 (Sunagawa et al., 2013). Taxonomic assignation was carried out with the COG0012, *ych*F gene. Summary species composition plots were created in R v.3.6.1 using the package ggplot2 v.3.3.2.

226 3.7 Metagenome-assembled genome (MAG) analyses

227 Genome binning was performed using MetaBAT2-2.12.1 (Kang et al., 2015), with a 228 minimum contig size of 1,500 nucleotides and the default settings. The quality of the resulting 229 prokaryotic bins was assessed with CheckM (Parks et al., 2015), and MAGs < 80% completeness 230 and/or > 10% contamination were excluded. Several MAG assemblies were refined by additional 231 binning, such as blastn analysis with reference genomes of related species. Contigs were then 232 filtered by percentage of the length covered, identity and coverage levels. Finally, manual curing 233 of questionable contigs (new, low coverage of homology on references, etc.) were performed by 234 blastn and blastx analysis against the nr/nt and nr NCBI databases, respectively. Annotations 235 were performed using the Rapid Annotation with Subsystem Technology server.

236 3.8 Phylogenomic and functional analyses

The Automatic Multi-Locus Species Tree web server (Alanjary et al., 2019) was used to determine closely related genomes based on core gene alignments of the sequenced genomes and recovered MAGs. The closest species were inferred based on the percentage of average nucleotide identity (ANI) calculated using FastANI, v.1.31 (Jain et al., 2018). The kSNP (v.3.0)
was used to perform the phylogenomic analysis using distances based on single nucleotide
polymorphism variations for the most representative species present in MAGs (Gardner et al.,
2015) with the maximum likelihood option and kmer size of 21. Genomes of the corresponding
species were downloaded from Genbank and combined with our MAG to compute this analysis.
Gene content analysis and metabolic reconstruction was performed on SEED using sequence and
function-based comparison tools (Aziz et al., 2012).

247 Functional analysis on metagenomes was performed by read mapping profiling with the 248 sequences of the 16 metagenomes from which the Cellulosimicrobium cellulans and goat reads 249 were removed to avoid bias in the gene quantification. The analysis of microbial pathways was 250 performed by HUMAnN 3.0 (Beghini et al., 2021)(REF) in order to evidence bacteriocin 251 production genes, potentially health-associated gene clusters or aroma pathways. To screen the 252 potentially health-associated gene clusters, we followed essentially a methodology described 253 previously (Leech et al., 2020). except the functional profiles were established with HumanN3. 254 These genes were binned into one of the following categories: survival, modulation, and 255 colonization in order to create a Heatmap using Pheatmap. Clusters counts displayed in the 256 heatmap were not absolute counts but scaled so that the values could be compared between the 257 samples. The genes potentially implied in bacteriocin production were searched with the term 258 "bacteriocin" and those of the diacetyl pathways with "Acetoin, Diacetyl, Acetolactate, Citrate 259 synthase, Citrate lyase, Citrate \[pro-3S\]-lyase and Oxaloacetate decarboxylase".

The search for antibiotic resistance (ABR) genes was performed by read mapping against the CARD database (Jia et al., 2017; McArthur et al., 2013) using the PATRIC web server (Antonopoulos et al., 2019). The presence of particular genes in reference genomes, ABR and genes of technological interest was determined using the PATRIC web server, the FoodMicrobiome tool (<u>https://migale.jouy.inra.fr/foodMicrobiome/</u>, and blast analysis. Additionally, FoodMicrobiome was used to detect the subdominant populations of given species with high sensitivity and reliability and to discriminate between subspecies.

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268 3.9 Data availability

Raw sequences were deposited on the European Nucleotide Archive (ENA) under the BioProject ID PRJNA860091 for shotgun metagenomic, amplicon and genomic reads. The MAGs are available in doi: 10.17632/7w4rd76ndj.2.

272

273 4 Results

274 4.1 Goat farmer and dairy producer's survey

275 According to the results of the questionnaire, 25% of the respondents were identified as 276 both producers and farmers, and 75% as producers only. Production depended on female 277 housekeepers (60%) aged between 40 and 70 years old, and had limited access to the local 278 market place (38%). Most of producers (88%) used only goat milk compared to 4% who used a 279 mixture of goat and cow milk, while the rest used goat Laban in addition to goat milk as the 280 primary dairy material. Producers who reared their own goat herd were able to process larger 281 milk quantities for the three fermented products (135 to 7,500 L/season) than producers who 282 purchased their goat milk (140 to 1,890 L/season). Farming and production parameters for each 283 product are summarized in Table S1.

284 Ambriss, Serdaleh and Labneh El Darff were made with milk from the Black Baladi race 285 that grazes in the Bekaa Valley, the Chouf Mountains and Southern Lebanon, respectively 286 (Figure 1A). All production phases were completely manual, the production scale was small to 287 medium (Third Quartile = 216.5 kg/season) and both tools and materials were artisanal. Production takes place during the period when the goats produce milk, i.e., from June to 288 289 November. The manufacturing process of Serdaleh and Ambriss lasts up to 6 months and 290 consists of fermenting raw goat milk on a daily basis in terracotta jars, except for 20% of 291 Serdaleh producers who used plastic barrels. The jars were first soaked with salt, periodically 292 refilled with fresh raw milk and salt, with periodic whey evacuation from a hole at their bottom 293 (Figure 1B and S1). The manufacturing of Labneh El Darff is conducted in a three-stage process 294 consisting of: (i) Laban production, which is prepared from raw goat milk inoculated with a 295 previously homemade inoculum produced by backslopping; (ii) filling the "Darff" (bag formed 296 by the whole goatskin, but sometimes cloth fabric) with the produced Laban; and (iii) straining 297 of the whey from the suspended Darff during a period of 6 weeks (Figure 1B and S2). The 298 manufacturing processes of these products are carried out at ambient temperature.

299 4.2 Physico-chemical and culture-dependent analyses

300 4.2.1 Temperature, pH and salinity

301 Temperature, pH and salinity levels were measured at the time the samples were collected 302 (Table S2). The ambient temperature at which the products were developed varied between 28°C 303 and 33°C for Ambriss and Labneh El Darff, but was lower (p < 0.05) for Serdaleh (between 304 20°C to 25°C). The pH values showed little variability within the same product type, unlike 305 salinity, which displayed greater intra-group variability (Figure 2A). The pH values were 306 comprised between 3.01 and 4.80. They were higher (p < 0.05) in Ambriss (4.08 to 4.80) when 307 compared to Serdaleh (3.01 to 4.12) and Labneh El Darff (3.62-4.62). The Serdaleh product had 308 the highest level (p < 0.05) of salinity (2.69 to 5.04%) compared to Ambriss (0.87 to 2.24%) and 309 Labneh El Darff (1.10 to 1.75%).

310 4.2.2 Culture-dependent analyses

The examination of culture results shows a significant variability in the different microbial enumerations (**Figure 2B**). We observed a dominance of mesophilic lactobacilli (MRS 30°C, 5.4-6.8 Log CFU/g) over lactococci (M17 30°C, 0.5-5.20 Log CFU/g) in the three products. Thermophilic lactobacilli counts were highly variable in Labneh el Darff (MRS 42°C, 1-6.2 Log CFU/g) compared to its other counterparts.

316 Overall, 279 strains belonging to 13 species groups were genetically identified by 16S 317 rRNA from 380 isolates. The most commonly cultivated species in the three fermented milks 318 was Lactiplantibacillus plantarum. This species appeared to be dominant in Ambriss (38% of 319 isolates in this product) and Serdaleh (77%), and co-dominant with other species in Labneh El 320 Darff (16%). In Ambriss, we also identified a strong prevalence of the species Enterococcus 321 durans and Lacticaseibacillus rhamnosus (18% of each), in Labneh El Darff, Levilactobacillus 322 brevis was the most frequently obtained cultured species (32% of isolates), followed by Lb. delbrueckii and L. lactis (16% of each) (Figure 2C). 323

324 4.3 Taxonomic composition using amplicon sequencing

The 16S rRNA amplicon-sequencing analyses were clustered in 209 OTUs, whose abundance was over the threshold of 0.005% in the whole dataset. The rarefaction curves of most of the analyzed samples reached the saturation plateau, indicating that the sequencing depth was sufficient (**Figure S3**). 329 The alpha-diversity analysis revealed lower richness of species in Labneh El Darff (p < 330 0.05) compared to the other two products (Figure 3A). Moreover, the Chao1, Shannon and InvSimpson indices, which measure evenness, confirmed this low diversity. The Principal 331 Coordinates Analysis (PCoA) showed that while Labneh El Darff samples were clearly 332 333 differentiated, samples of Serdaleh and Ambriss could not be clearly separated and thus likely 334 shared a similar bacterial microbiota (Figure 3B). Indeed, the analysis of their taxonomical composition (Figure 3C and Table S3) showed that Lactobacillus delbrueckii was the main 335 336 species present in Labneh El Darff samples, representing 55 to 82% of the counts, whereas it was 337 undetected or at levels below 0.4% in the samples of Ambriss and Serdaleh. Moreover, the samples of the latter products contained L. lactis, Lb. kefiranofaciens and Lentilactobacillus 338 339 kefiri as the major species and, to a lesser extent, Lentilactobacillus diolivorans-group. 340 Differential analysis of OTUs showed that Serdaleh samples had greater L. lactis abundance than Ambriss ($p_{adj} < 0.01$). Remarkably, in the PCoA (Figure 3B), these two products appeared to be 341 342 spread along Axis 1 as a function of the proportion between Lactococcaceae and 343 Lactobacillaceae species. In particular, a group of 12 Serdaleh samples contained L. lactis at 344 levels of 58-83%, while the other samples were intermixed on the other part of this axis. 345 Moreover, the 13 samples of Serdaleh collected in 2019 contained low levels (0.67-2.2%) of 346 Mycoplasmopsis agalactiae or M. bovis (Table S3). Finally, three Ambriss samples showed 347 divergent compositions compared to the others: A3-b was dominated by Lentilactobacillus 348 buchneri, A4 by the S. parasuis-sanguinis group (> 53% of the reads), and A6 by high amounts 349 of species poorly present in other samples such as L. gasseri (~36%), Lc rhamnosus (~23%) and 350 Enterobacteriaceae (> 18% of reads). The other species, usually detected at low levels in the 351 various samples, mainly belonged to the Gammaproteobacteria class, such as Aeromonas sp., 352 Citrobacter sp., Klebsiella sp. and Escherichia-Shigella.

353 4.4 Refined microbiota by metagenomics

For a refined taxonomical analysis, 16 samples were selected to perform shotgun metagenomic approaches. Such analyses allow a taxonomic identification up to the species-strain level and the simultaneous assessment of the level of reads corresponding to bacteria and fungi. Moreover, these analyses make it possible to detect eventual virulence factors in pathogenic species, antibiotic resistance genes and genes of technological interest.

Food metagenomic samples may contain animal reads, which may significantly bias the analysis when they are in high abundance. Since the present products are manufactured from 361 goat milk, we tested for the presence of *Capra hircus* reads that were detected at levels ranging 362 from 2.3 to 72% (**Table S4**). They were notably abundant in Labneh El Darff samples where 363 they accounted for more than 50%, as a consequence of the process mode where the product is 364 drained in a goatskin.

365 4.4.1 Species-level assignments by shotgun metagenomics

366 In a first approach, the MetaPhlAn tool, which identifies species by mapping the metagenomic reads against a genomic database, was used to determine the taxonomic 367 368 composition of the samples. It yielded 98 bacterial and one eukaryotic species (Table S5). 369 Species composition obtained by this analysis was relatively in accordance with those obtained 370 with the 16S rRNA amplicon. Interestingly, it resolved most taxonomical assignation ambiguities for lactic acid bacteria such as Lt. kefiri, Lt. diolivorans, Lactiplantibacillus 371 372 plantarum, Lactobacillus helveticus and S. thermophilus, and also for contaminants such as S. 373 parauberis and M. agalactiae. It also detected the yeast Saccharomyces cerevisiae, but at low 374 levels and in only three samples.

375 In order to characterize microbiota independently of fixed references, we applied a marker 376 gene analysis from the assembled metagenomes, which yielded 104 bacterial and 15 fungal 377 species (Table S6). The overall composition is shown in Figure 4. Although the main bacterial 378 species identified here were consistent with the previous analysis made by read profiling, some 379 differences merit highlighting. Whereas MetaPhlAn attributed 35% of the reads of A4 to S. 380 parauberis, the marker gene analysis detected only 6.9% of this species and further detected another streptococcal species, S. parasuis, which retained 55% of the reads. This species was 381 382 also detected at low levels in four other samples, while S. parauberis was found in eight samples, 383 generally at low levels. This analysis also confirmed the frequent presence at low levels of 384 several species of Enterobacteriaceae such as E. coli, K. pneumoniae and C. freundii, and of 385 Enterococcaceae such as E. faecalis and E. faecium. Lastly, it also established that L. lactis 386 subsp. lactis was detected in all samples, whereas the cremoris subspecies was detected at concentrations ten times lower in S8 and S10-b. A specific analysis by read mapping confirmed 387 the presence of L. lactis subsp. cremoris at 5-15% lower abundance than that of the lactis 388 389 subspecies in most samples.

Finally, 14 species of yeasts whose genomes are absent from the MetaPhlan database were identified by marker gene analysis. The most frequent and abundant were *Pichia kudriavzevii* and, to a lesser extent, *S. cerevisiae* and *Kluyveromyces marxianus*. Nevertheless, yeast relative
abundance was generally below 1%, except in Labneh El Darff where it reached 8%. A more
sensitive analysis performed by read mapping (**Table S7**) confirmed the presence of these yeasts
at low levels in more samples, as well as that of *Torulaspora delbrueckii*.

396 4.4.2 MAGs and strain-level analyses of LAB

397 A total of 62 prokaryotic Metagenome Assembled Genomes (MAGs) of high quality were 398 reconstituted from the metagenome assemblies (Table S8). The majority of the MAGs 399 correspond to Lactobacillaceae such as Lt. diolivorans (12), Lt. kefiri (10), Lb. kefiranofaciens 400 (9), Lp. plantarum (5) and L. gasseri (1). The two yoghurt species Lb. delbrueckii subsp. 401 bulgaricus (1) and S. thermophilus (1) were also recovered from Labneh El Darff and MAGs of 402 L. lactis subsp. lactis (5) were reconstituted from Ambriss and Serdaleh products. In addition, the 403 results included MAGs of the goat pathogen M. agalactiae (6) from Serdaleh samples, and of 404 milk contaminants such as S. parauberis (3), S. parasuis (1), Escherichia coli (1), Klebsiella 405 pneumoniae (1), Aeromonas caviae (2) and Acetobacter spp. (2).

406 Further detailed analysis was performed with the lactococci and lactobacilli MAGs and 407 genome sequences of the most frequent and sometimes dominant species in the three products 408 (Table S9). Phylogenomic analysis of the L. lactis FME150 genome and the five L. lactis MAGs 409 was performed with 215 reference genomes of this species, representing strains from its two 410 main subspecies (lactis and cremoris) and isolated from different environments (dairy, vegetable, 411 animal, etc.) (Figure 5A). In this analysis, five groups could be highlighted, one of which 412 included all the representatives of the cremoris subspecies (brown branches), and three were 413 formed by (i) industrial dairy strains (in red), (ii) diacetylactis biovariant strains (in blue), and 414 (iii) dairy strains isolated from traditional products (in violet). The last group (green branches), 415 which was the most diverse, contained environmental strains (plants, animals, etc.). The five L. 416 lactis MAGs from Ambriss sand Serdaleh were included in this last group (highlighted by 417 external red arrows).

A similar study was done with *Lb. kefiranofaciens, Lt. kefiri Lt. diolivorans* and *Lp. plantarum.* The *Lb. kefiranofaciens* FME151 genome and the eight *Lb. kefiranofaciens* MAGs assembled from Serdaleh (6) and Ambriss (3) metagenomes were compared to seven genomes present in the NCBI database, including those of the two type strains for the subspecies *kefiranofaciens* and *kefirgranum.* These strains were isolated from kefirs of different origins. 423 ANI analysis showed that all strains shared at least 98.1% identity and could be divided into two 424 main groups, one made by kefir strains and the second by Ambriss and Serdaleh strains, where ANI were ~99.2-99.4% within each group and ~98.2-98.4% between groups. Further 425 426 phylogenomic analyses (Figure 5B) showed that two groups could be differentiated within kefir 427 strains, a first one with three strains sharing over 99.9% identity and including the Lb. 428 kefiranofaciens subsp. kefiranofaciens type strain, and a second one with four strains that were 429 more divergent between themselves, sharing 99.0 to 99.8% identity and including the Lb. 430 kefiranofaciens subsp. kefirgranum type strain. Lastly, Ambriss and Serdaleh strains also formed 431 two groups sharing 99.4 to 99.8% ANI within and 99.1 to 99.3% outside of their group. Analysis 432 of gene composition confirmed and refined these results. First, it showed a very high relatedness 433 of three Lb. kefiranofaciens subsp. kefiranofaciens strains from kefir that shared more than 95% 434 of their genes (> 2,325 out of \sim 2,440 genes), while within each of the other groups, the strains 435 were more divergent between themselves (87% of shared genes in the kefirgranum group, 88% 436 in the Serdaleh group and 92% in the Ambriss group). Seventeen EPS-related genes involved in 437 kefiran production present in a 14.4-kb region were present only in the three former strains, 438 whereas only the first part of the operon containing the genes of enzymes involved in EPS 439 regulation and priming was conserved in the other strains. Furthermore, in the latter strains, the 440 genes involved in polymerization, chain length determination and export that could be 441 characterized appeared to be different in each strain, indicating that they produce 442 polysaccharides other than kefiran.

443 The Lt. kefiri FME71 genome and the ten Lt. kefiri MAGs assembled from Ambriss (3), 444 Serdaleh (6) and Labneh El Darff (1) were compared to the ten reference genomes present in the 445 NCBI database, including seven strains isolated from kefir, two from human gut and one from 446 yoghurt. This analysis showed that all strains shared very high ANI values (> 99.55%), 447 indicating that they were closely related (Table S10). Analysis of their phylogenomic tree did 448 not indicate clustering as a function of the origin of the strains (Figure S4A). Furthermore, the 449 analysis of the core/pan genome showed that all strains shared $\sim 2,148$ genes out of ~ 2400 . The 450 analysis of the specific genes in the different strains indicated that they code mostly for 451 "hypothetical proteins" (50%) and mobile element proteins (25%).

452 ANI analysis of *Lb. diolivorans* FME74 and of our 12 MAG strains with that of the type 453 strain (isolated from maize silage) and one MAG from an ultra-filtered-milk-permeate 454 fermenting bioreactor showed that these strains could be clustered into four groups (**Figure** 15 455 S4B), displaying at least ~97.7 to 98.4% ANI . Serdaleh MAGs formed a group of very closely
456 related strains (ANI > 99.9%), Ambriss and Labneh MAGs formed a second homogenous group
457 (ANI > 99.1%), whereas the bioreactor MAG and the type strain were isolated.

458 The sequences of Lp. plantarum FME91 strain and of the five MAGs obtained from 459 Serdaleh were analyzed with a set of 145 Lp. plantarum strains isolated from different 460 ecosystems, including several types of food, animals, gut, etc. The five MAGs from Serdaleh 461 appeared to be almost identical (ANI > 99.97%), but unrelated to that of FME91 from Ambriss 462 (ANI ~92.7%), and they ranged between 95.7 and 99.7-99.9, with an average of 98.7 with the 463 strains of the set (Table S10). An overview of the phylogenic relationship between these strains 464 is given by the tree obtained by kSNP analysis (Figure S4C). Strains were dispersed irrespective 465 of their environmental origin. The Ambriss strain FME91 was closely related to those isolated 466 from milk or artisanal dairy products, whereas the Serdaleh strains were closely related to those 467 isolated from meat, fruits and vegetables.

468 4.4.3 Detection of metabolic features by functional profiling

469 Microbial pathway analysis was carried out by HUMAnN 3.0 in order to highlight 470 interesting features in the microbial communities such as bacteriocin production, clusters of 471 genes potentially associated with health or aromatic pathways. Bacteriocin genes were searched 472 in the 16 metagenomes, and 29 potential bacteriocin-encoding genes were identified (Table 473 S11). The most frequent and abundant were Lactococcin 972 family bacteriocin and Helveticin, 474 which are mainly from L. lactis and Lb. kefiranofaciens, respectively. Other frequent potential 475 bacteriocin-encoding genes are Plantaricin and Thiazolpeptide-type bacteriocin, likely present in 476 Lp plantarum and Lt diolivorans, respectively.

477 Potentially health-associated gene were divided into three broad categories, "survival", 478 "colonization" and "modulation", as presented previously (Leech et al., 2020). Briefly, these 479 gene clusters were shown to be important for surviving in the gut conditions, colonizing the gut 480 microbiome and stimulating immune system or microbiota products. While most samples displayed relatively similar profiles, several samples appeared to have different profiles (Figure 481 482 S5). For example, Ambriss A6 presented the highest ratio of survival clusters, while Ambriss A4 483 presented the lowest ratio for all clusters. A search for overrepresented genes in Ambriss A6 484 highlighted the presence of genes from *Lb. gasseri*, a species that was found only in this sample.

The low scores in Ambriss A4 could be due to the dominance of *S. parasuis* and the lowabundance of LAB in this sample.

Finally, genes involved in diacetyl metabolism were searched through citrate utilization, acetolactate and acetoin-butanol production. Since genomic references were known for dominant species of these microbiota, the corresponding genes could be assigned at the species level. It confirmed that the citrate-lyase cluster was absent from *L. lactis* strains but present in *Lb. kefiranofaciens* in our samples. Finally, the diacetyl degrading enzymes acetolactate decarboxylase (EC 4.1.1.5) and acetoin (diacetyl) reductase (EC 1.1.1.304) were found in *L. lactis*, *Lt. kefiri* and *Lt. diolivorans*, respectively.

494 4.4.4 Detection of pathogens by metagenomic analysis

495 Marker gene analysis showed that undesirable species were present in several Ambriss 496 and Serdaleh samples. All Serdaleh samples collected in 2019 contained low levels (1-4%) of the 497 goat pathogen M. agalactiae. Moreover, zoonotic streptococcal species, namely S. parauberis and S. parasuis, were detected at 0.5-2% in several samples of Ambriss and Serdaleh and, 498 499 remarkably, at 7 and 55%, respectively, in Ambriss A4. S. aureus was detected at low levels in 500 Serdaleh S10-b. Finally, Enterobacteria such as E. coli and K. pneumoniae were detected in 501 about half of the samples at levels < 1% (except for K. pneumoniae present at 2.7% in Ambriss 502 A1). Deep profiling analysis in the metagenome samples was performed to detect the presence at 503 low abundance of pathogen species potentially found in dairy products (Table S7). No Brucella 504 abortus, Listeria monocytogenes, Mycobacterium vaccae or Staphylococcus agalactiae were 505 detected. However, S. aureus was detected at low levels in five Serdaleh samples.

Further analyses were performed on these undesirable species, which were sufficiently covered to yield MAGs. An ANI analysis of these MAGs with representative genomes of these species confirmed the taxonomic classification previously obtained by the *ychF* marker. For example, *M. agalactiae, S. parauberis* and *K. pneumoniae* MAGs share 99.8, 98.5 and 98.4% ANI with the type strains of their species, *E. coli* MAG; 99.1% with *E. coli* K12 laboratory strain, *S. parasuis* MAG; and 97-98% with four genome references of this species present in the NCBI database.

513 Gene content analysis was performed with *S. parasuis* MAG_A4, which appears to be 514 dominant in Ambriss A4. In particular, genes involved in lactose metabolism were searched to 515 explain the fitness of this strain in milk fermentation. Among the two systems used for lactose transporter, the phospho-beta-galactosidase, the tagatose pathway, glucokinase, a repressor and a gene of unknown function (LacX). A blast search with these genes provided a hit at 97-99% nucleotide identity on its entire length with an ICESsuJH1308-1 mobile element present in *S. suis* JH1308 and a lower identity with several other *S. suis* strains. However, none of the nine *S. parasuis* genomes available contained these genes. These data show that *S. parasuis* MAG_A4 acquired lactose utilization genes by horizontal transfer, possibly from *S. suis*.

523 Interestingly, MAGs from *M. agalactiae* were of very good quality, probably due to 524 particular features of their sequences, such as genomic guanine-cytosine content (~29.7%) and 525 di-tri-nucleotide composition, allowing a better binning. In particular, MAGs from Serdaleh S8 526 and S9 consisted of only four and ten contigs, respectively. ANI analysis indicated that the 527 strains from the Serdaleh samples were very closely related to each other (ANI > 99.9%), as well 528 as to the type strain (ANI ~99.85%; Table S10). Phylogenomic analysis confirmed the close relationship of *M. agalactiae* Serdaleh MAGs together and with PG2^T (Figure 5C). Furthermore, 529 530 gene content analysis indicates that these two MAGs differed from PG2^T by less than 20 genes 531 encoding hypothetical proteins.

532 4.4.5 Detection of antibiotic resistance genes

A mapping-based approach against a comprehensive collection of antibiotic resistance genes was performed. A total of 18 ABR genes were identified, belonging to seven different classes of antibiotics (**Figure 6**). They were detected in almost all samples, and notably those from Serdaleh had higher levels and more diverse genes than those from Ambriss. Concerning the Labneh samples, only sample L18 presented detectable amounts of ABR. However, it cannot be concluded that L15, L16 and L17 samples did not contain ABR because there were not enough useful reads in these samples due to the presence of goat DNA.

Overall, the most abundantly detected antibiotic classes were aminoglycosides, MLS (Macrolide, Lincosamide, Streptogramin), nucleosides and tetracycline. In particular, Serdaleh samples contained high levels of aminoglycoside (aad(6) and APH(3'')-IIIa), MLS (ermB), nucleosides (sat-4) and tetracycline (tetS). The coverage of these genes is similar to that of *L*. *lactis*, which was the highly dominant species in these samples. Since this level of coverage allows a reliable level of assembly, we searched for contigs carrying these determinants by BLAST analysis in Serdaleh samples. This search pointed out two contigs of 12,360 and 3,370 547 nucleotides in sample S10-b, with coverages ~2 times that of *L. lactis*, and carrying, respectively, 548 the four first determinants and *tetS*. The first contig is ~98% identical on 76-85% of its length to 549 large plasmids from *E. faecium*, *E. faecalis* and *Staphylococcus pseudointermedius*. The second 550 contig is identical on its full length to regions of plasmids and genome drafts of various food 551 bacteria such as *L. raffinolactis*, *L. lactis*, *S. thermophilus*, *Carnobacterium divergence* and 552 *Listeria innocua*. The other Serdaleh metagenomes contained contigs of comparable sizes 553 indicating similar events.

554 The metagenome of Serdaleh S10-b also contained a ~6.6 kb contig carrying the *tetL*, 555 tetM and cat genes that was identical on its entire length to regions of plasmids from E. faecalis. 556 The coverage of this contig is 40 times lower compared to the two former ones, which is a level 557 corresponding to that of Lt. kefiri, Lb. kefiranofaciens and Lt. diolivorans. None of the other 558 metagenomes contained these three genes together on one contig. Nevertheless, samples S8, S7-559 b, S8-b, S9-b and S11-b contained contigs of ~5 and 0.9 kb carrying tetLM and cat genes, 560 respectively. The coverages of these contigs were significantly different in the other assemblies 561 where tetLM coverage was 2 to 10 times higher that of cat genes, indicating that their 562 organization might be different from that found in S10-b.

Lastly, in Ambriss A4, *tetM* was found on a ~32 kb contig of S. *parasuis, ermB* on a 7 kb contig sharing 90% identity on 3 kb with plasmids of various Lactobacillaceae, *cat* on a ~3 kb contig sharing 93% identity to *L. garviae* plasmids, *aad* and *sat* on a ~23 kb contig sharing 93% identity on ~12 kb (including *aad* and *sat*) of the *S. agalactiae* B111 chromosome and 99% identity on 4-6 kb of *E. faecalis* plasmids and the *S. pseudointermedius* chromosome.

568 **5** Discussion

569 Traditional Lebanese fermented goat milk products are perceived in Lebanon as having 570 an important historical and cultural heritage, but their microbiota are still poorly characterized. A 571 detailed characterization of 50 producers allowed us to select those who used genuine traditional 572 processes for the production of Ambriss, Serdaleh and Labneh El Darff. The manufacturing 573 processes were established and the physico-chemical characteristics of the products were 574 determined. Our survey also made it possible to define the socio-economic profiles of the 575 producers, which confirmed the danger of extinction of these products, thus making it possible to 576 require a Protected Designation of Origin label. This study explored the microbial biodiversity of 577 34 samples of three fermented goat milk products from three regions by combining578 microbiological, genomic and metagenomic approaches.

The samples analyzed here shared similar technical properties for pH, salinity, temperature and microbial counts as those of the same products previously studied (Dimassi et al., 2020; Serhan et al., 2016; Nasbimana et al., 2005; Semaan Hajj et al., 2011), and were therefore probably (Semaan Hajj et al., 2011)(Semaan Hajj et al., 2011)(Semaan Hajj et al., 2011)(Semaan Hajj et al., 2011) representative of these products in Lebanon.

584 5.1 Microbial originality of traditional Lebanese fermented goat milk products

585 An overall view of the microbiota is provided by metagenetic analysis, which deciphers 586 species or lower taxonomic levels. This study clearly separated Labneh samples from those of 587 Ambriss and Serdaleh. Labneh contained a relatively simple microbiota, strongly dominated by 588 Lb. delbrueckii, which was almost absent from the other products. Furthermore, it contained Lt. 589 diolivorans, Lt. kefiri and S. thermophilus to a lesser extent. The dominance of Lb. delbrueckii is 590 due to the way Labneh is inoculated by Laban, whose composition is that of yoghurt made of Lb. 591 delbrueckii and S. thermophilus (Chammas et al., 2006). The dominance of L. bulgaricus is 592 probably due to its better resistance to acidity than S. thermophilus (Béal & Chammas, 2012). 593 Similar observations were made with voghurt and Doogh (also known as Ayran), a traditional 594 Iranian fermented ewe milk product (Davati & Hesami, 2021). The presence of Lt. diolivorans 595 and Lt. kefiri, which are also found in Ambriss and Serdaleh, might be due to the specificity of 596 the local goat milk. Moreover, the conditioning of Labneh in a goatskin may also influence the 597 microbial composition by releasing nutrients or other metabolic products, as indicated by the 598 very high level of goat DNA obtained from the metagenomic data for Labneh. Interestingly, Lt. 599 diolivorans is usually found in vegetable and fruit fermentation, whereas it is occasionally 600 reported in dairy products (Tamang et al. 2005; C. Zhang et al., 2010; Zheng et al., 2020). To the 601 best of our knowledge, it was isolated from one raw milk in Brazil (Agostini et al., 2018), 602 traditional yoghurts in Iran (RoushanZadeh et al., 2014), traditional fermented dairy products in 603 Mongolia (Yu et al., 2011), and detected in metagenomic samples of Koumiss (You et al., 2022; 604 Kozhakhmetov et al., 2014). The present study is thus the first one reporting the genome of Lt. 605 diolivorans isolated from a dairy product.

Ambriss and Serdaleh samples contained, as dominant species, *L. lactis* and *Lb. kefiranofaciens*, which were almost absent from Labneh, followed by *Lt. kefiri* and, to a lesser

608 extent, by *Lt. diolivorans* and *Lp. plantarum*. Interestingly, this composition was reminiscent of 609 that of dairy kefir, a fermented milk with health properties, which is produced by the inoculation 610 of a stable and complex microbial community made of lactic acid bacteria and yeasts entrapped 611 in gelatinous grains (Blasche et al., 2021; Prado et al., 2015; Nalbantoglu et al., 2014). In this 612 product, the dominance of *Lb. kefiranofaciens*, which otherwise grows poorly alone in milk, is 613 attributed to the metabolic cooperation it develops with the community, and the synthesis of an 614 exopolysaccharide.

615 In this respect, growth conditions in Ambriss and Serdaleh, where the microbiota 616 remained essentially in a coagulated milk matrix, displayed strong similarities with the one 617 encountered in the kefir grain, which may thus explain the dominance of this particular 618 Lactobacillus and of several sub-dominant lactic acid bacteria. MAGs and genome comparisons 619 of Lb. kefiranofaciens and Lt. kefiri confirm the very close phylogenomic relationship between 620 kefir, Ambriss and Serdaleh strains. Their gene content mainly differed by unknown functions 621 and mobile elements. In Lb. kefiranofaciens strains isolated from Ambriss and Serdaleh and in 622 Lb. kefirgranum subspecies strains, only the first six genes encoding the general functions of 623 initiating and controlling EPS synthesis were conserved, whereas glycosyl transferase conferring 624 the specific structure of EPS units differed. This fact explains why these strains did not produce 625 kefiran, the specific polysaccharide for kefir grain formation. Lastly, metabolic cooperation in 626 Ambriss and Serdaleh certainly differed from that of kefir, as suggested by the low level of 627 Leuconostoc and Acetobacter species, which play an important role in milk fermentation and 628 citrate metabolism (Laëtitia et al., 2014). Nevertheless, the low input of milk on a the coagulated 629 milk matrix gradually offers an environment for this "slow growing species" that is Lb. 630 kefiranofaciens (Blasche et al., 2021; Georgalaki et al., 2021). Since the microbiota of Ambriss 631 and Serdaleh were not inoculated, the environmental origin of Lb. kefiranofaciens in these 632 products still remains unknown. Interestingly, this species was also found to be dominant in 633 several samples of Airag, a traditional Mongolian fermented mare milk made in horse-hide 634 containers (Watanabe et al., 2008) and in Koumiss (M. Zhang et al., 2020), neither of which 635 contain grain.

636 In the present set of samples, the balance between *L. lactis* and *Lb. kefiranofaciens* 637 appeared to be the main factor differentiating Ambriss and Serdaleh, the former generally 638 containing lower levels of *L. lactis* and higher levels of *Lb. kefiranofaciens*. Nevertheless, the 639 samples of these two similarly processed products, originating from two distinct regions, could 21 640 not be clearly separated since some samples of Serdaleh were also dominated by Lb. 641 kefiranofaciens. Although Serdaleh samples were obtained at lower temperatures, displayed 642 higher salt content, and reached lower pH in comparison to Ambriss samples, these factors do not fully explain this population shift. Alternatively, there may be subtle differences in 643 644 production methods, such as the quantity of milk added at once, or a potential mixing that 645 modifies the speed of milk infiltration through the product, which may affect the metabolism of 646 the microbial communities in different ways, as discussed earlier. For example, if a significant 647 quantity of the milk poured into the jar is not mixed with the curd, it may favor a rapid 648 planktonic development of L. lactis, compared to the slow solid-state development where Lb. 649 kefiranofaciens and Lt. kefiri compete more effectively.

650 A second important outcome of this study is the detection of uncultivated species as 651 dominant microbiota in Ambriss and Serdaleh. While the initial failure to isolate Lb. 652 kefiranofaciens from the samples can be explained by the fact that this species is tedious to grow 653 and requires specific media and growth conditions (Georgalaki et al., 2021), the lack of recovery 654 of L. lactis is less understandable. Indeed, this bacterium is routinely cultured from different 655 environments such as plant or dairy products (Soundharrajan et al., 2021; Li et al., 2020). In this 656 work, we thus tested the hypothesis that *L. lactis* cells were viable but not-cultivable (VBNC) 657 (Oliver, 2010) and would thus require specific conditions to recover growth throughout their 658 transfer from the product to M17 medium. Actually, a transfer of several hours in media 659 containing goat milk allowed a straightforward isolation of strains of this species. This result 660 indicates that the production process of Ambriss and Serdaleh induced a particular physiological 661 state in L. lactis cells that hampers its growth recovery, thus corresponding to the definition of 662 VBNC. Indeed, during the Ambriss and Serdaleh process, various environmental factors (such as pH, salinity and temperature) and the physiological age of the culture could induce the entry of 663 664 bacterial cells into a VBNC state. Interestingly, the present process is still reversible, which is 665 rarely the case (Dong et al., 2020), and hence offers a reproducible model for the study of the 666 entry into the VBNC state. Further work would be required to understand why L. lactis growth recovery was deprived when directly plated on M17. 667

668

669 5.2 Potential safety concerns

670 A wide metagenomic search for bacteria potentially involved in public health issues 671 indicated the presence of DNA of several kinds of undesirable species. Among hygiene 22

indicators, Enterobacteria were detected at low levels in about half of the samples, as well as S. 672 673 aureus, which was detected at low levels, mostly in Serdaleh samples. These results are 674 comparable to those of a recent study on raw cow milk where, from a total of 195 samples 675 collected from different Lebanese farms, 65% and 17% of the samples were non-compliant with 676 national standards for Escherichia coli and S. aureus, respectively (Joubrane et al., 2022). 677 Enterobacteriaceae are often reported as a typical bacterial population in raw milk from many mammalian origins (Ramos & Nascimento, 2021). They can also be transmitted to milk and 678 679 dairy products by fecal contamination during the milking process or because of poor hygiene 680 conditions (Giraffa, 2003). S. aureus was highly prevalent in some products and was the most 681 frequent contaminant of milk and goat milk products (Oliveira et al., 2020; Xing et al., 2016). 682 The transmission of S. aureus to milk is due to its ability to form biofilms and to remain on 683 surfaces and utensils, its presence being mainly attributed to poor handling during processing 684 (Kümmel et al., 2016).

685 A striking finding was the presence of several zoonotic streptococcal species such as S. 686 parauberis and S. parasuis, which were detected at 0.5-2% in several samples of Ambriss and 687 Serdaleh, respectively, and even at 7 and 55% in Ambriss A4. S. parasuis is an important pathogen for humans and pigs (Nomoto et al., 2015) and was already isolated as a contaminant in 688 689 raw camel milk. Intriguingly, in Ambriss A4, S. parasuis was strongly dominant over the 690 traditional lactic acid bacteria, which accounted for only 10% of the population. The fact that the 691 pH of this sample has a value similar to that of the other samples indicates that the strain of S. 692 *parasuis* present in this sample is an acidifying strain. Indeed, our analysis revealed the presence 693 of ten genes encoding a Lac-PTS system in its genome, similar to the one that allows efficient 694 lactose utilization in several lactic acid bacteria such as L. lactis (Aleksandrzak-Piekarczyk, 695 2013). These genes were probably acquired by a horizontal gene transfer from S. suis. 696 Adaptation to lactose utilization in milk has already been observed for other non-starter 697 streptococci, in particular, S. infantarius in fermented dairy products from East and West Africa 698 (Jans et al., 2013) and in artisanal cheese from Brazil (Kothe et al., 2021).

699 Serdaleh samples contained low levels (1-4%) of the goat pathogen *M. agalactiae*. This 700 bacterium is one of the causal agents of contagious agalactia, a serious enzootic disease of small 701 ruminants, which notably occurs in the Mediterranean Basin (Kumar et al., 2014). Once it has 702 infected the animal, it disseminates though the blood to different mucosa, including the 703 mammary gland, and can consequently be found in milk. *M. agalactiae* has already been 23 detected in artisanal cheeses via non-cultural techniques (Martín-Platero et al., 2009). Its
presence here is, therefore, a sign that the herd in the Chouf region was infected with this
pathogen.

Finally, transmissible antibiotic resistance genes, which are considered to be a growing threat to public health (Ghimpețeanu et al., 2022; Yadav & Kapley, 2021), were detected. In particular, Serdaleh samples contained a multi-resistance cassette carrying aad(6) and APH(3'')-IIIa, ermB and sat-4, as well as tetracycline resistance genes. Since these antibiotics are used in prophylaxis for *M. agalactiae*, it is likely that such treatment contaminated the milk and favored the emergence of antibiotic resistant lactic acid bacteria strains.

713 6 Conclusion

714 In this study, we analyzed three artisanal Lebanese fermented products (Ambriss, 715 Serdaleh and Labneh El Darff) that are processed from the raw milk of the Black Baladi goat, a 716 local breed. The process consists of the daily introduction of salted milk or Laban into a 717 terracotta jar or a goatskin over several months, together with the draining of the whey, until the 718 container is full. This production remains highly artisanal and offers opportunities for the 719 empowerment of women, but it is in danger of extinction due to the low volumes that are 720 produced, the age of the producers and the absence of marketing. In industrial products that are 721 inoculated with starters or by backslopping, the microbiota rapidly develops in large batches of 722 milk, whereas in the current products, it develops slowly during percolation of the milk that is 723 added periodically. During batch growth, fast-growing microorganisms are highly favored, 724 whereas in a dense community, slow-growing bacteria can compete more effectively, as is the 725 case with the well-described kefir grain where *Lb. kefiranofaciens* clearly predominates despite 726 its poor growth performance in milk. Interestingly, kefir is promoted as a probiotic beverage and 727 Lb. kefiranofaciens is presented as a key factor in this attribute (Georgalaki et al., 2021). 728 Although no studies have yet proven this, traditional Lebanese goat milk products are believed to 729 deliver health benefits, and it would thus be interesting to further test this possibility. These 730 products are also interesting as sources of biodiversity because they contain strains of Lb. 731 kefiranofaciens and Lt. kefiri, which are genetically quite different from those present in kefir 732 that are highly conserved.

Furthermore, progress has to be made to ensure the safety of these products from herd prophylaxis to milk chain management via a global action in order to avoid contamination by 24 potential pathogens and the spread of antibiotic resistance genes. Finally, this study also provides
key elements related to the microbiology and microbiota functioning of these products that will
facilitate the development of strategies to improve these processes and preserve their identity.

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739 7 Acknowledgements

740 This work was supported by the PHC CEDRE program 2018 (French-Lebanese campus), 741 project number 40316UJ), the Lebanese University Grant Research program, and the French 742 Dairy Interbranch Organization (CNIEL, Centre National Interprofessionnel de l'Economie 743 Laitière), Paris, France. The authors are grateful to the INRAE MIGALE bioinformatics facility 744 (MIGALE, INRAE, 2020. Migale bioinformatics Facility, doi: 745 10.15454/1.5572390655343293E12) for providing computing and storage resources.

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1058 9 Figure legends

Figure 1. Geographical origin (A) and schematic processing diagram (B) of Ambriss, Serdaleh and Labneh El Darff. Ambriss and Serdaleh are made in terracotta jars periodically filled with raw goat's milk, and Labneh El Darf in goatskin filled with Laban, which is either a homemade yoghurt of raw goat milk. The detailed flow charts are presented in Figure S1 and S2.

Figure 2. Physico-chemical and microbiological characteristics of Ambriss, Serdaleh and
Labneh El Darff: Temperature, pH and salinity (A); boxplot representation of microbial counts
on M17 and MRS (B); and histogram of isolated species (C).

Figure 3. Metagenetic analysis based on OTU data of Ambriss, Serdaleh and Labneh El Darff: Boxplots of alpha-diversity indices (A); Principal coordinate analysis among bacterial communities identified by OTUs (B); bacterial composition plot depicting the relative abundances of the 20 main OTUs (C). Presence of different letters (a, b, c) above the box-plots indicate their statistical significance compared to the others

- 1071 Colors in (A) and (B) refer to the different fermented milk products, i.e., yellow for Ambriss,1072 blue for Serdaleh and red for Labneh El Darff.
- 1073 Figure 4. Relative abundance of microbial composition of Ambriss, Serdaleh and Labneh El1074 Darff.
- 1075 Values were calculated from the coverage of the *ychF* marker gene assembled in the 1076 metagenomes. The asterisk (*) indicates a low depth of the sequences for L15, L16 and L17 1077 samples.
- 1078 Figure 5. Phylogenomic tree for L. lactis (A), Lb. kefiranofaciens (B) and M. agalactiae (C).
- 1079 The different groups of *L. lactis* are highlighted. The colors of the branches make it possible to
- 1080 visualize cremoris subspecies (brown), environmental sp. lactis strains (green), industrial dairy
- 1081 sp. lactis (red), *diacetylactis* biovariant (blue) and *lactis* sp from traditional dairy products
- 1082 (violet). The internal circle presents the environment from which the strains were isolated (blue:

- 1083 milk; green: vegetable; purple: animal). Ambriss and Serdaleh MAGs and the isolated strain
- 1084 genome are highlighted by external red arrows and names are shaded in gray

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- 1086 Figure 6. Heatmap showing distribution of the 18 antibiotic resistance genes detected in reads/kb
- 1087 within the 13 metagenomic samples.
- 1088 MLS: Macrolide, Lincosamide and Streptogramin.
- 1089 10 Supplementary Material
- 1090 Figure S1: Flow chart of the Ambriss and Serdaleh manufacturing process
- 1091 Figure S2: Flow chart of the Labneh El Darff manufacturing process

1092 Figure S3. Rarefaction curves depicting the depth of 16S sequencing and species richness for the

- 1093 data obtained from Ambriss, Serdaleh and Labneh El Darff.
- 1094 The x-axis represents the sequencing depth (reads) and the y-axis represents the estimated OTU 1095 richness detected at the species level.
- Figure S4: Phylogenomic tree forLb. kefirano, Lt. kefiri (A), Lt. diolivorans (B) and Lp.
 plantarum (C).
- 1098 Figure S5: Heatmap showing the presence of potentially health-associated gene clusters across 1099 the Lebanese fermented goat milk product samples. Gene clusters are binned according to the 1100 potential ability of the microbiota to colonize the gastrointestinal tract, survive transit to the gut,
- and modulate the host phenotype. Each line is standardized across all samples, allowing only
- 1102 products to be compared with each other.
- 1103 Table S1: Producer survey results of production parameters, rearing practices and price1104 indicators related to Ambriss, Serdaleh and Labneh El Darff.
- 1105 **Table S2:** Physico-chemical parameters and culture counts of Ambriss, Serdaleh and Labneh El
- 1106 Darff samples as a function of their producers and production dates.
- 1107 **Table S3**. Percentage (%) of bacterial operational taxonomic units (OTUs) in the samples.
- 1108 **Table S4**. Percentage (%) of *Capra hircus* reads aligned in each fermented food metagenome.

- 1109 Table S5. Relative abundance of microbial composition of 16 traditional fermented goat milk1110 metagenomes from Lebanon using the MetaPhlAn taxonomic assignment method.
- **Table S6**. Relative abundance of microbial composition of 16 traditional fermented goat milk
 1112 metagenomes from Lebanon using *ychF* marker gene assignation.
- **Table S7.** Relative abundance of microbial composition of 16 traditional fermented goat milk
- 1114 metagenomes from Lebanon using the *FoodMicrobiome* tool.
- **Table S8**. Quality of prokaryotic MAGs
- **Table S9**. Genomes sequenced and assembly statistics
- 1117 Table S10. FastANI values for MAGs, isolated strain genomes and NCBI reference genomes for
- 1118 L. lactis, Lb. kefiranofaciens, Lt. kefiri, Lt. diolivorans, L. plantarum, M. agalactiae and S.
- *parasuis*.
- **Table S11**. Bacteriocin profile (in gene counts) of 16 traditional fermented goat milk
- 1121 metagenomes from Lebanon.