



Characterizing Halloumi cheese's bacterial communities through metagenomic analysis

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ABSTRACT

Halloumi is a semi-hard cheese produced in Cyprus for centuries and its popularity has significantly risen over the past years. High-throughput sequencing (HTS) was applied in the present research to characterize traditional Cyprus Halloumi bacterial diversity. Eighteen samples made by different milk mixtures and produced in different areas of the country were analyzed, to reveal that Halloumi's microbiome was mainly comprised by lactic acid bacteria (LAB), including *Lactobacillus*, *Leuconostoc*, and *Pediococcus*, as well as halophilic bacteria, such as *Marinilactibacillus* and *Halomonas*. Additionally, spore forming bacteria and spoilage bacteria, were also detected. Halloumi produced with the “traditional” method, had significantly richer bacterial diversity compared to Halloumi produced with the “industrial” method. Variations detected among the bacterial communities highlight the contribution of the initial microbiome that existed in milk and survived pasteurization, as well as factors associated with Halloumi manufacturing conditions, in the final microbiota composition shaping. Identification and characterization of Halloumi microbiome provides an additional, useful tool to characterize its typicity and probably safeguard it from fraud products that may appear in the market. Also, it may assist producers to further improve its quality and guarantee consumers' safety.

1. Introduction

Halloumi cheese originated from Cyprus and has been produced on the island for centuries (Welz, 2015). Nowadays due to its great popularity “Halloumi-type” cheese is produced in low-quantities in the region known as “Levant”, including Lebanon, Syria, and Turkey, but also in other countries, such as United Kingdom, Bulgaria, and Sweden. Halloumi cheese production follows the standard CYS 94 (Parts 1,2 for fresh and mature Halloumi cheese, respectively) which was set in 1985 by Government bodies (CYS 94, 1985). As described by Papademas and Robinson (Papademas & Robinson, 1998), traditional fresh Halloumi is made by fresh pasteurized milk, which is coagulated by rennet, and after the “cooking” step, the cheese is left to briefly cool down, manually folded, salted, sprinkled with dry *Mentha viridis* leaves and stored overnight in 11–12% NaCl whey until the individual Halloumi cheese pieces (250gr) are vacuum-packed and kept at 6 °C until consumption. For mature Halloumi cheese production, the fresh cheese is stored in the whey brine (11–12%) NaCl for 40 days at 15–20 °C, before vacuum packed. Regarding the type of milk, the standard CYS 94 (CYS 94, 1985) indicates that goat and/or sheep milk should be used but

accepts the presence of cow milk.

Halloumi is characterized by unique organoleptic characteristics arising from the specific methods of production, as well as by the contribution of the indigenous microflora that exists in the milk (Papademas & Robinson, 1998). The application of thermal process and the absence of starter culture, indicates that the existing microbiome is affected by several factors, including: a) milk pasteurization and cooking procedures, b) microbial contamination by rennet, as well as salt and *Mentha viridis* leaves addition, c) microbial contamination from dairy unit environment and d) the preservation in brined whey (CYS 94, 1985; Calasso et al., 2016; De Pasquale et al., 2014; Delcenserie et al., 2014; Stellato, De Filippis, La Stora, & Ercolini, 2015; Yeluri Jonnala, McSweeney, Sheehan, & Cotter, 2018). Culture-based techniques identified the presence of spore forming bacteria, such as *Bacillus*, as well as thermophilic species, such as members of the genus *Lactobacillus* and *Enterococcus*, in addition to yeasts, in Halloumi samples (Bintsis & Papademas, 2002; Tamime, 2007). In 2001, phenotypic and phylogenetic analyses led to the characterization of a novel, salt-tolerant species in Halloumi samples, named *Lactobacillus cypricasei* sp. nov., (Lawson et al., 2001), which was later found to be heterotypic synonym

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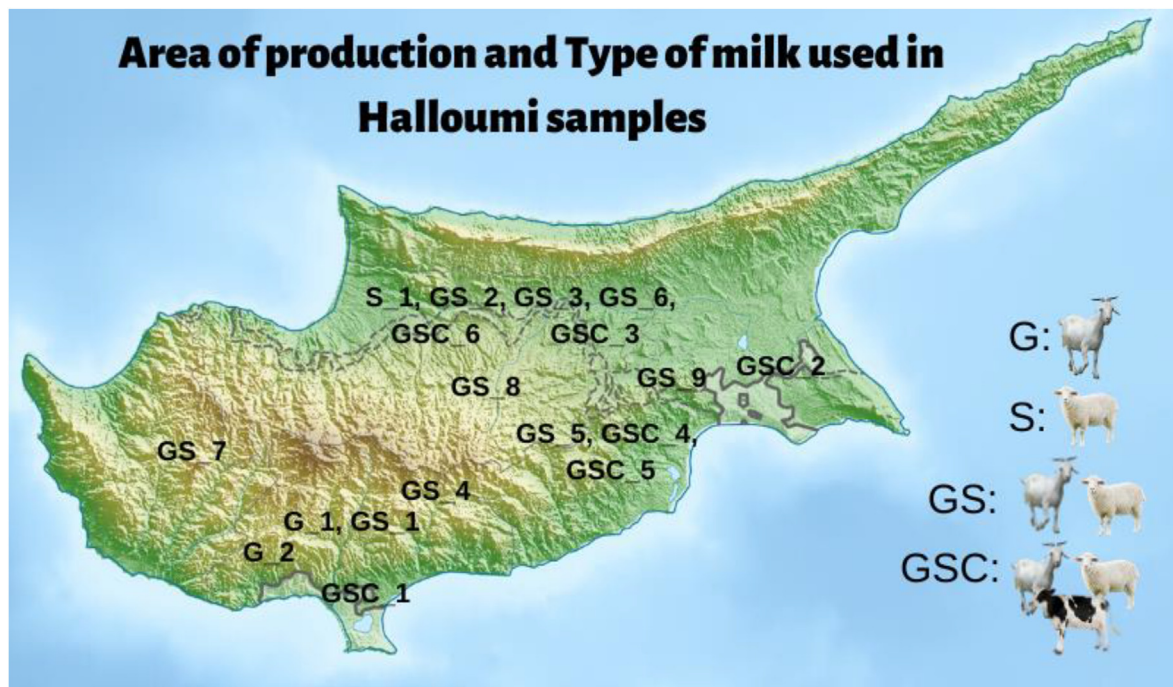


Fig. 1. Map of Cyprus showing the areas of production and type of milk used in Halloumi samples as used in the present study.

Table 1

Information regarding the Halloumi samples used in the present study.

Product no	Area of production	Type of milk	Description
G_1	Pachna, Limassol	Goat	Traditional
G_2	Anarita, Paphos	Goat	Traditional - Mature
S_1	Akaki, Nicosia	Sheep	Traditional
GS_1	Anogyra - Limassol	Goat & sheep	Traditional
GS_2	Akaki, Nicosia	Goat & sheep	Traditional
GS_3	Strovolos, Nicosia	Goat & sheep	Traditional
GS_4	Paramitha, Limassol	Goat & sheep	Traditional
GS_5	Aradipou, Larnaca	Goat & sheep	Traditional
GS_6	Strovolos, Nicosia	Goat & sheep	Traditional
GS_7	Simou, Paphos	Goat & sheep	Traditional
GS_8	Anagia, Nicosia	Goat & sheep	Traditional - mature
GS_9	Athienou, Larnaca	Goat & sheep	Traditional
GSC_1	Ypsonas, Limassol	Goat & sheep & cow	Industrial
GSC_2	Dasaki Achnas, Famagusta	Goat & sheep & cow	Industrial
GSC_3	Strovolos, Nicosia	Goat & sheep & cow	Industrial
GSC_4	Aradipou, Larnaca	Goat & sheep & cow	Industrial
GSC_5	Aradipou, Larnaca	Goat & sheep & cow	Industrial
GSC_6	Akaki, Nicosia	Goat & sheep & cow	Industrial

of *Lactobacillus acidipiscis* (Kim et al., 2011; Naser, Vancanneyt, Hoste, Snauwaert, & Swings, 2006; Sun et al., 2015).

Despite Halloumi's high consumption globally, the autochthonous microbial communities that affect its unique organoleptic properties and are associated with the product's safety for consumers, have not yet been evaluated. The application of High Throughput Sequencing (HTS) technology will facilitate the identification of the complex microbial communities of Cyprus Halloumi. Amplicon sequencing technology enables comprehensive characterization of the microbiota within a sample with higher sensitivity and higher throughput detection, compared to other molecular techniques through massive parallel sequencing of small fragments of universally conserved DNA sequences, such as the bacterial 16S rRNA gene (Bokulich & Mills, 2013). Due to the

capabilities of microbial communities to generate thousands of reading sequences, this fact may provide the potential to characterize them, including even low-abundance bacteria. Additional advantages of applying the current technology for the identification and characterization of the microbial communities in Protected Denomination of Origin (PDO) cheeses has been reviewed recently (Kamilari, Tomazou, Antoniadis, & Tsaltas, 2019). The microbiome of Halloumi can be expected to be diverse among producers due to variations in the microbial composition of the milk, differences associated with the manufacturing conditions, including geographical area, microbiota of the dairy plant environment and animal breed of the milk (Bokulich & Mills, 2013; Dalmaso et al., 2016; Yeluri Jonnala et al., 2018; Kamilari et al., 2019).

The main contribution of this paper is to reveal the bacterial communities of Cyprus Halloumi, as sold in the Cypriot market, produced by small or large industries, with or without the addition of cow milk, following the CYS 94 (1985) standard. Microbiome analysis has been achieved using Illumina MiSeq amplicon sequencing. The extracted findings may enable the characterization of the microbiome developed in Cyprus Halloumi and assist to the improvement of the product quality and safety for consumers. Importantly, the current analysis provides indications whether the microbiome may be used as an additional tool in order to define the typicity of Cyprus Halloumi.

2. Methods

2.1. Sample collection

Halloumi samples were collected from production sites (dairies) and the market. Specifically, five samples were collected from the production sites and thirteen were collected from supermarkets, with the criteria: a) to be produced in different geographic areas of the Republic of Cyprus and b) being composed by goat and/or sheep milk (considered as "traditional"), or a mixture of goat, sheep and cow milk (considered as "industrial") (see Fig. 1, Table 1). The two manufacturing methods are furthermore differentiated by harsher heat treatments performed by large industries in order to extend the shelf life of the product kept after refrigerated conditions. From these samples twelve were made only by

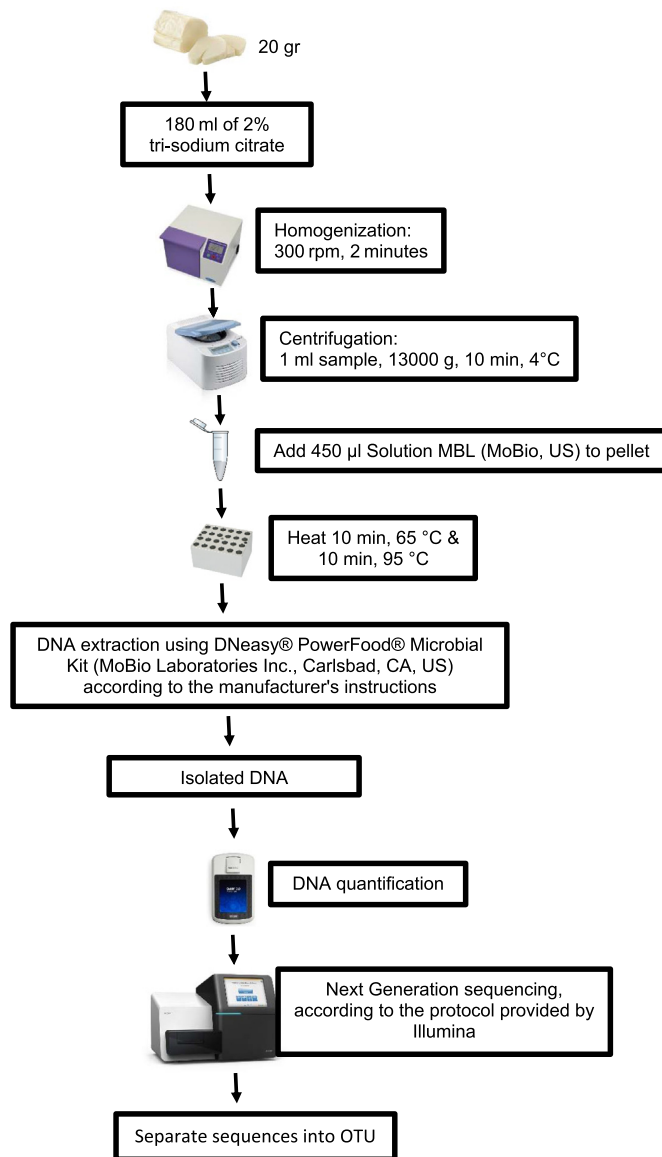


Fig. 2. Flowchart of bacteria isolation and characterization process.

goat or sheep milk or by mixture of goat and sheep milk and six by a mixture of goat, sheep and cow milk. Sixteen of the Halloumi samples were fresh and two were matured (40 days ripened). Samples were transported in cool conditions (ice packs) and stored at -20°C until processing.

2.2. Metagenomic DNA extraction

For sample homogenization, 20 g of Halloumi were homogenized in 180 ml of 2% tri-sodium citrate (Honeywell, Europe) using Stomacher 400 Circulator (Seward, UK) at 300 rpm for 2 min. DNA extraction was performed using DNeasy® PowerFood® Microbial Kit (MoBio Laboratories Inc., Carlsbad, CA, US) according to the manufacturer's instructions, with the following modification: after the addition of 450 µl Lysis Solution MBL during the cell lysis step, the samples were incubated for 10 min in 65°C and for additional 10 min in 95°C . The extracted DNA was stored at -20°C until processing. Flowchart of the process of bacterial DNA isolation and characterization is presented in Fig. 2.

2.3. Quantification of total DNA

The total DNA isolated from the Halloumi samples was quantified fluorometrically with Qubit 3.0 fluorometer (Invitrogen, Carlsbad, CA) using Qubit dsDNA HS Assay Kit (Invitrogen). The purity of the DNA was evaluated by measuring the ratio of absorbance A_{260}/A_{280} nm and A_{260}/A_{230} nm using spectrophotometer (NanoDrop Thermo Scientific, USA).

2.4. Barcoded Illumina MiSeq amplicon sequencing of bacterial 16S rRNA gene

The amplification of 16S rRNA bacterial gene - was performed using primers targeting the V3–V4 hyper-variable region using the paired-end approach according to the protocol provided by Illumina (**Error! Hyperlink reference not valid.**). The 16S rDNA V3–V4 amplicon was amplified using KAPA HiFi Hot Start Ready Mix (2X) (TaKaRa Bio Inc., Japan). The two universal bacterial 16S rRNA gene amplicon PCR primers used were forward primer (TCGTCGGCAGCGTCAGATGTGTA TAAGAGACAG) and reverse primer (GTCTCGTGGGCTCGGAGATGTG TATAAGAGACAG) with the addition of the overhang adapter sequence. Nextera XT Index Kit (FC-131-2001, FC-131-2002) was used for the multiplexing step. The DNA concentration of each PCR product was determined using Qubit dsDNA High sensitivity assay and quality was assessed using a bioanalyzer (Agilent 2200 TapeStation) (expected size ~ 550 bp). All amplicon products from different samples were mixed in equal concentrations and purified using Agencourt Ampure Beads (Agencourt Bioscience Corporation, MA, USA). The sequencing runs were performed using a MiSeq 300 cycle Reagent Kit v2 (Illumina, USA), on a MiSeq Illumina sequencing platform.

2.5. Microbiome and statistical analysis

For 16S rRNA DNA sequence clustering and Operational Taxonomic Unit (OTU) filtering, Ribosomal Database Project Classifier (Wang, Garrity, Tiedje, & Cole, 2007) against the Illumina-curated version of GreenGenes reference taxonomy database (DeSantis et al., 2006) was used. The classified organisms were converted to percentages in each sample in order to understand the representation of each organism in the sample and OTU representing less than 0.001% were excluded. Alpha diversity metrics (Shannon, Inverse Simpson and Chao1) were estimated using the EstimateS version 9.1.0 for Windows 10 (<http://viceroy.eeb.uconn.edu/estimates/index.html>). For Inverse Simpson diversity significance, as well as among bacterial species significant differences, between the traditional and the industrial groups, Mann-Whitney U test (MACKLIN, 1947) was applied, using SPSS statistical package (v.18.0 for Windows; SPSS, Chicago, IL, USA). Stacked Column chart and Weighted Venn diagram of the major OTUs in genus level filtered at 5% and 1% abundance respectively in at least one sample were used for the co-occurrence/co-exclusion analysis using Microsoft Excel and Microsoft Word respectively. Heatmap of hierarchical clustering of the dominant bacterial genera per Halloumi sample was performed using the Seaborn library of Python (<https://seaborn.pydata.org>).

All sequence data were deposited in Sequence Read Archive (SRA) under BioProject PRJNA598815.

3. Results

The present study was performed to characterize the bacterial communities present in Cyprus Halloumi samples, based on the mixture of milk used and the area of production, considering that the manufacturing conditions were according to the standards, using the HTS approach.

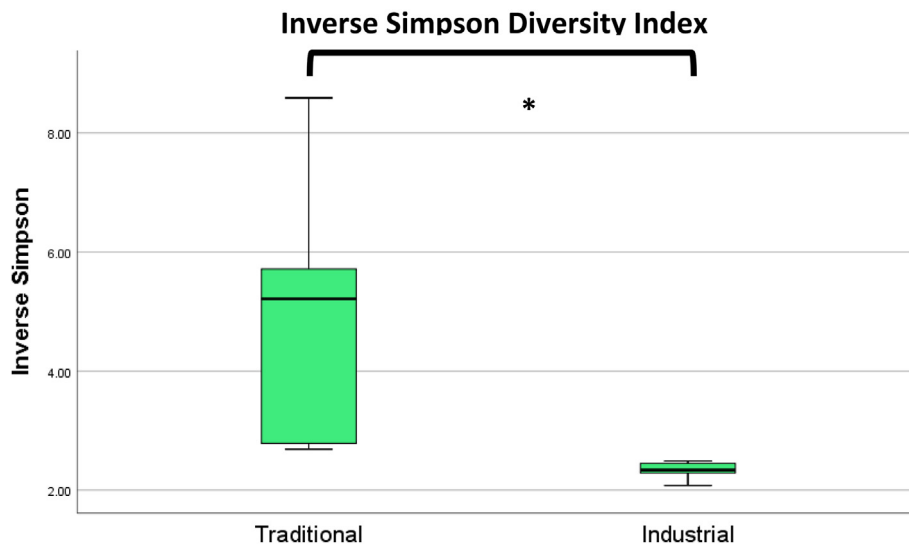


Fig. 3. Boxplots showing alpha diversity analysis metrics with Inverse Simpson difference between traditionally and industrially made Halloumi. * $p = 0.000$ from the Mann-Whitney U test.

3.1. Abundance and diversity of members of the bacterial microbiota

Eighteen (18) examined sample sets were used as input to the Illumina MiSeq in order to generate:

- 2,791,099 high quality sequencing reads, with an average of 155,061.1 sequencing reads per sample (range = 16,621–630,104, STD = 16,650.4) at the family level,
- 2,764,127 high quality sequencing reads, with an average of 153,562.6 sequencing reads per sample (range = 16,485–625,388, STD = 16,5385.4) at the genus level and
- 2,411,369 high quality sequencing reads, with an average of 133,964.94 sequencing reads per sample (range = 12,541–577,516, STD = 155,939.98) at the species level, and average length of 548 bp (Table S1). High quality sequences were grouped into average number 234.55 OTUs (range = 142–435, SD = 91.17). Shannon, inverse Simpson and Chao1 estimators for genus level are also shown in Table S1.

Higher diversity was observed in samples produced with the “traditional” method, made by goat and/or sheep milk, in comparison to Halloumi made by a mixture of goat, sheep and cow milk, according to the “industrial” method, as was indicated with Inverse Simpson estimator (Fig. 3). The two diverse manufacturing conditions differed significantly ($p \leq 0.05$) based on Mann-Whitney U test.

3.2. Taxonomic composition of bacterial communities in Halloumi samples

Using 16S rRNA gene sequencing, seven bacterial phyla were identified, consisting mostly of Firmicutes, and Proteobacteria, as well as Actinobacteria and Bacteroidetes, along with three additional phyla (Chloroflexi, Cyanobacteria and Tenericutes). Analysis of the relative abundance of bacterial phyla revealed that Firmicutes and Proteobacteria were the predominant phyla in all Halloumi samples tested. This finding is consistent with other cheese-related 16S rDNA metagenomic studies (Dalmasso et al., 2016; Giello et al., 2017).

The predominant bacteria comprised LAB genera, such as *Lactobacillus*, *Leuconostoc*, *Pediococcus*, *Weissella* and the halophilic, alkaliphilic *Marinilactobacillus* (Fig. 4). Additionally, spore forming bacteria, including the genus *Bacillus*, psychrophilic or psychrotolerant bacterial genera, such as *Psychrobacter*, the halophilic genus *Halomonas*, as well as the genera *Pseudomonas*, *Staphylococcus*, *Acinetobacter*, *Macrococcus* and *Vibrio*, member of which may cause food spoilage (Li et al.,

2014; F.; Liu, Wang, Du, Zhu, & Xu, 2010; Towner, 1992) were also commonly detected. The most commonly detected species included the members of the genera *Lactobacillus*, such as *L. manihotivorans*, *L. alimentarius*, *L. brevis* and *L. parakefiri* and *Marinilactobacillus*, such as *M. psychrotolerans* (see Fig. 5).

3.3. Relationships between bacterial communities among Halloumi samples

To get an overall view on the identified associations among Halloumi samples, based on their bacterial communities' structure, a hierarchically clustered heatmap was produced (Fig. 6). The heatmap plot depicted the normalized relative abundance of the dominant bacterial genera (relative abundance > 1% in two samples or > 3% in one sample) (variables clustering on the Y-axis) within each sample (X-axis clustering). The hierarchically clustered heatmap revealed that:

- Most of Halloumi samples were clustered together. This cluster was characterized by elevated relative abundance of the genus *Lactobacillus*. Other genera also associated with *Lactobacillus* were *Pediococcus* and *Weissella*, as well as *Leuconostoc* and *Pseudomonas* in a lower degree. This cluster included all the industrial samples but sample GSC_5. Additionally, samples GS_3, GS_5, GS_6 and GS_9 were also included.
- Sample GSC_5 was related to sample G_1 in a separate cluster, characterized by the presence of *Psychrobacter*.
- Sample GS_2 was differentiated from the other samples by the presence of *Macrococcus*.
- Another cluster was characterized by the presence of *Marinilactobacillus*. This cluster included samples S_1, GS_4 and GS_7.
- Finally, GS_1 created a separate cluster close related to the elevated relative abundance of *Marinilactobacillus* cluster, and was characterized by elevated relative abundance of *Salinivibrio* and *Vibrio*.

4. Discussion

The present study is the first -to our knowledge-which targets to characterize the bacterial communities established in Cyprus Halloumi by metagenomic analysis. HTS was applied for an in-depth quantitative characterization of the structure of the bacterial population. The study aimed at identifying how the microbiota is shaped in Cyprus Halloumi and whether the different milk mixtures used for Halloumi manufacturing affect the bacterial communities' formation of the final

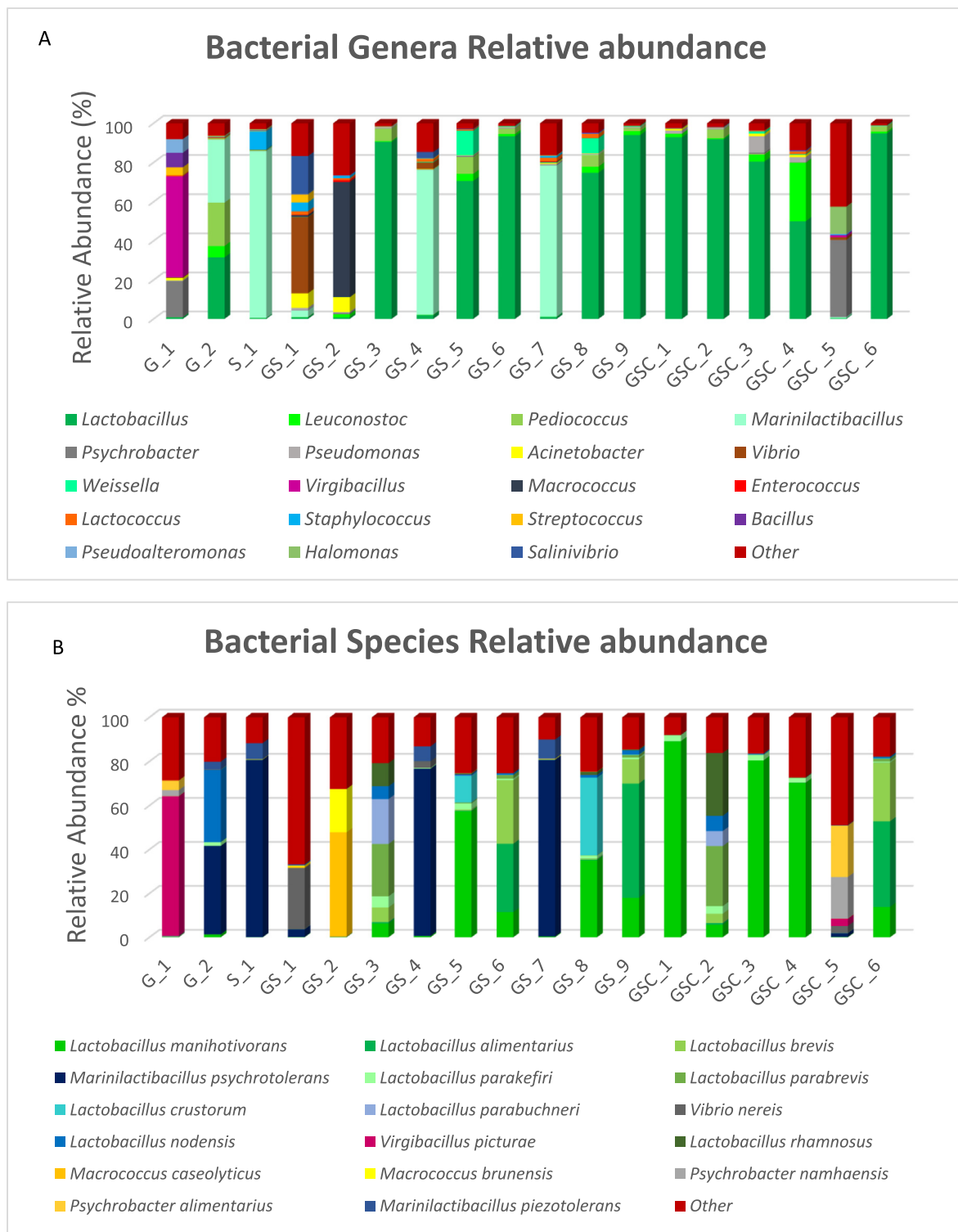


Fig. 4. 3D 100% Stacked Column chart of the relative abundance of the major taxonomic groups detected by HTS at genus (A), and species (B) level for 18 Halloumi samples. Only OTUs with an incidence above 5% in at least one sample are shown.

product. Based on the fact that (according to the standard CYS 94) Halloumi cheese is made from fresh pasteurized milk, the microbiota was expected to consist of thermophilic bacteria, in accordance to 16S rDNA metagenomic studies performed in other brined cheeses made by pasteurized milk, such as the PDO Oscypek cheese (Alegria, Szczesny, Mayo, Bardowski, & Kowalczyk, 2012) and Gouda cheese (Salazar et al., 2018), but also in other PDO cheeses including Herve (Delcenserie et al., 2014) and Pecorino Toscano cheese (De Pasquale

et al., 2014).

OTU analysis of the data from 16S rRNA gene sequences revealed that the bacterial communities of Halloumi samples in their majority were dominated by species of the genus *Lactobacillus*. Their capacity to survive in low pH and high salt concentrations in combination to successfully ferment lactose makes them predominant in several cheeses, as well as contributors to sensorial characteristics development (Fernández, Hudson, Korpela, & De Los Reyes-Gavilán, 2015, Kamilari

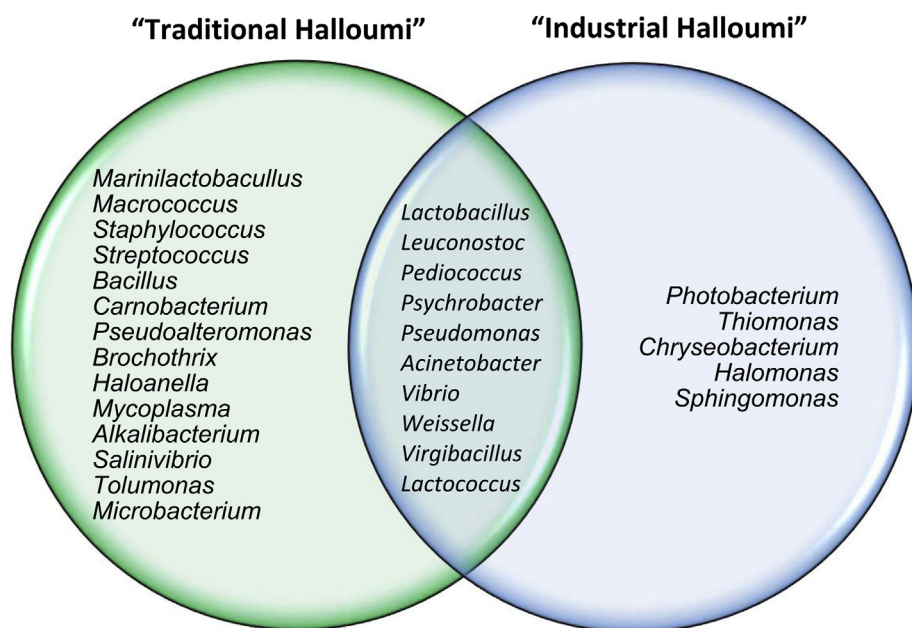


Fig. 5. Weighted Venn diagram representing shared and unique bacterial compositions in “traditional” and “industrial” Halloumi. The bacterial OTUs at the genus levels were defined with 16S rRNA gene sequences based on a cut-off value of > 97% sequence similarity. Only OTUs with an incidence above 1% in at least one sample are shown.

et al., 2019). Additional genera that co-occurred in some Halloumi samples, included *Leuconostoc* and *Pediococcus*. The presence of these genera were also reported in various metagenomic studies, including Oscypek cheese (Alegria et al., 2012) and Italian high-moisture Mozzarella cheese (Marino et al., 2019). Remarkably, samples produced according to the “industrial” method were characterized by significantly lower diversity in genus level, compared to Halloumi manufactured according to the “traditional” method. However, the lower bacterial diversity could not be attributed to the addition of cow milk. A recent study, indicated that Halloumi made by 100% goat's milk had almost the same to slightly higher total bacterial counts compared to Halloumi made by different mixtures of cow and goat milk (Elgami, Moussa, & Saleh, 2017). Quigley et al. (Quigley et al., 2012) indicated that Irish artisanal cheeses made by cow milk had different and richer bacterial diversity compared to cheeses made by goat or sheep milk. Based on this, the reduction in the bacterial diversity in “industrial” Halloumi, is most probably associated with the manufacturing conditions applied (i.e. harsher heat treatments).

Some “traditionally” produced Halloumi were characterized by the dominant presence of the halophilic LAB *Marinilactibacillus* (Fig. 4). Species which belong to this genus might have been transferred to Halloumi through sea salt originated from the Cyprus marine environment, in accordance with a similar report by Yumoto et al. (Yumoto, Hirota, & Yoshimune, 2011). The 16S rDNA metagenomic analysis study of Halitzia cheese, another white-brined cheese of Cyprus, reported the dominant presence of *Lactobacillus* and *Leuconostoc*, in addition to *Lactococcus*, but not of *Marinilactibacillus* (Papademas et al., 2019).

The most commonly detected species included the members of the genera *Lactobacillus*, such as *L. manihotivorans*, *L. alimentarius*, *L. brevis* and *L. parakefiri* and *Marinilactibacillus*, including *M. psychrotolerans*. The existence of these species in cheese samples is familiar from other studies (Alegria et al., 2012; Aquilanti et al., 2011; Bora & Ward, 2015; Ishikawa et al., 2013; Lacerda et al., 2011; Ledina et al., 2018). In comparison with other white brined cheeses, *L. brevis* was detected in the traditional Greek Feta PDO cheese (Bozoudi, Torriani, Zdragas, & Litopoulou-Tzanetaki, 2016; Rantsiou, Urso, Dolci, Comi, & Cocolin, 2008) and the Spanish PDO Alberquilla cheese (Abriouel, Martín-Platero, Maqueda, Valdivia, & Martínez-Bueno, 2008), and *Leuconostoc mesenteroides* in Feta (Bozoudi et al., 2016) and the traditional Egyptian soft Domiati cheese (El-Baradei, Delacroix-Buchet, & Ogier, 2007), via

PCR-denaturing gradient gel electrophoresis (DGGE) analysis.

The dominant species of Halloumi differed from those found via metagenomic studies performed in the white brined cheeses Mozzarella (PDO) and Parmigiano Reggiano (PDO), in that *Streptococcus thermophilus*, *Lactococcus lactis*, *Lactobacillus delbrueckii*, *Lactobacillus helveticus*, *Lactobacillus kefirifaciens*, as well as *Lactobacillus fermentum*, and *Lactobacillus delbrueckii*, *Lactobacillus helveticus* and *S. thermophilus* respectively, were the most abundant bacterial species (De Filippis, La Storia, Stellato, Gatti, & Ercolini, 2014; Ercolini, De Filippis, La Storia, & Iacono, 2012; Marino et al., 2019). However, the microbiome of these cheeses is affected by the addition of natural whey cultures (NWCs), in which thermophilic and mesophilic LAB are the most dominant. In addition, HTS methodologies indicated that the microbiome of the traditional feta like Iranian cheese Liqvan was characterized by different LAB species compared to Halloumi, such as *Lactobacillus curvatus*, *Lactobacillus zeae*, *Lactobacillus fuchunensis*, *Lactococcus lactis* and *Lactobacillus pentosus* and *Lactobacillus kefiri* (Ramezani, Hosseini, Ferrocino, Amoozegar, & Cocolin, 2017). The increased representation of LAB in Halloumi, including *Lactobacillus* sp., *Leuconostoc* sp., *Pediococcus* sp. and *Weissella* sp. members of which possess antimicrobial properties, reduces the risk of colonization of food-borne diseases causing bacteria, such as *Listeria monocytogenes*, *Staphylococcus aureus*, *Salmonella* spp., and pathogenic *Escherichia coli* (Arqués, Rodríguez, Langa, Landete, & Medina, 2015) providing an indication of improved safety of the product for consumers. Interestingly, the species *Marinilactibacillus psychrotolerans* is also known to possess an anti-*Listeria* effect (Roth, Schwenninger, Eugster-Meier, & Lacroix, 2011).

Members of the family Bacillaceae, including *Bacillus* and *Virgibacillus* were also detected in increased relative abundance in one traditional Halloumi made by goat milk. The dominant occurrence of this family in addition to *Lactococcus* was reported in Gouda cheese (Salazar et al., 2018). Species of this family are considered contaminants from milk or might have originated from other sources (e.g. dry *Mentha viridis* leaves) and their capability to create biofilms as well as heat-resistant endospores, allow them to survive from sanitization processes. Elevated relative abundance of members of the family Vibrionaceae, such as *Salinivibrio* and *Vibrio* was additionally found in sample GS_1. These salt-tolerant contaminants might have originated also from the marine environment (Sawabe et al., 2013). Further contaminants that were detected in increased relative abundance in samples G_1 and GSC _5, include the genera *Pseudoalteromonas* and

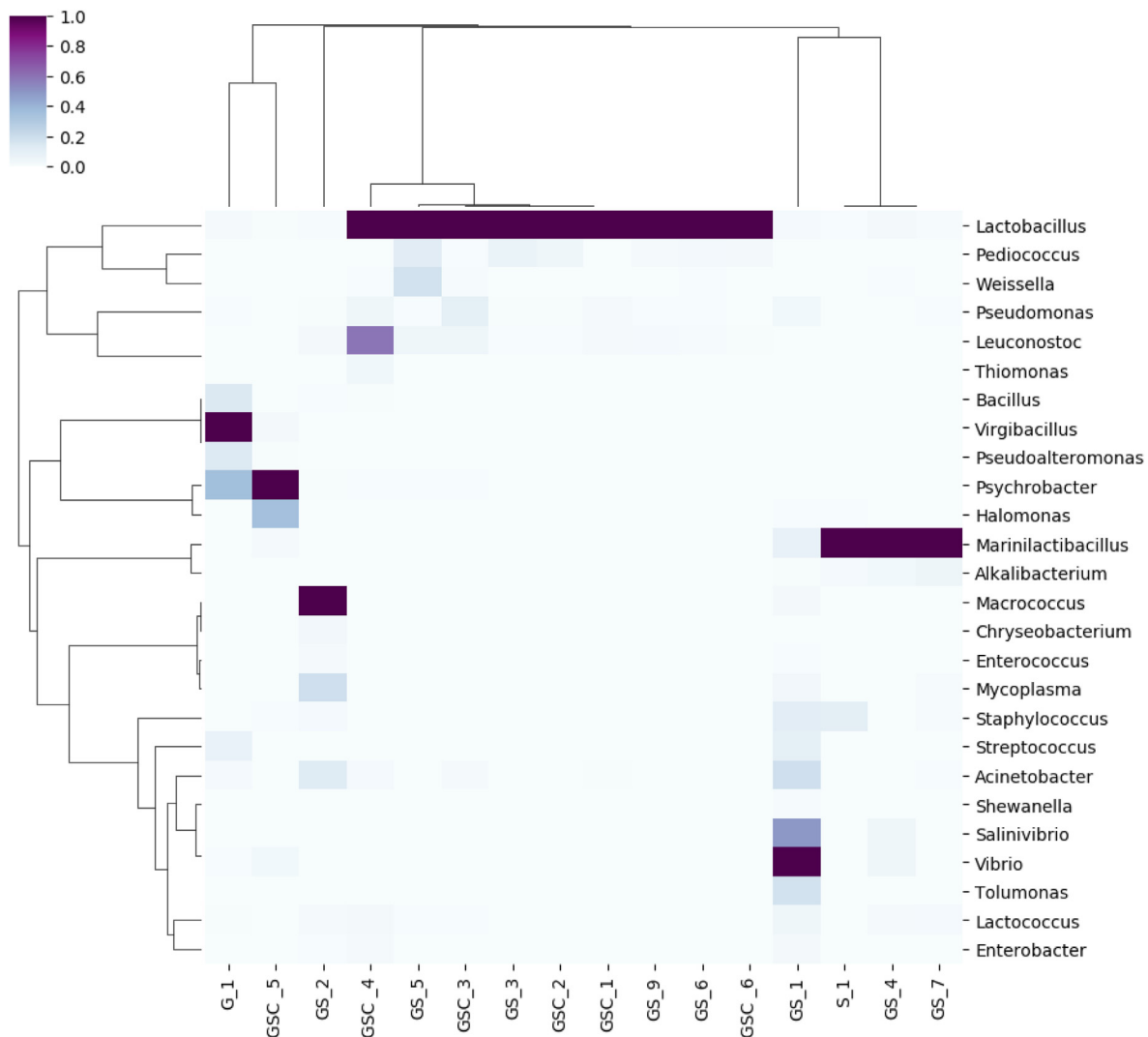


Fig. 6. Heatmap of hierarchical clustering of the dominant bacterial genera (% relative sequence abundance ≥ 1 in at least two samples or ≥ 3 in one sample) represented by 16S ribosomal RNA (rRNA) amplicons per Halloumi sample. Heatmap color (white to purple) displays the row scaled relative abundance of each taxon across all samples. Heatmap rows and columns distance metric were clustered based on Pearson correlation. (For interpretation of the references to color in this figure legend, the reader is referred to the Web version of this article.)

Halomonas, and *Psychrobacter*. The presence of these genera has also been detected in Herve (PDO) cheese (Delcenserie et al., 2014) and could be explained by preservation in brine before packaging. The existence of salt-tolerant bacteria and their adaptation to a high-salt environment has been reported in metagenomic studies of artisanal cheeses (Fuka et al., 2013; Quigley et al., 2012).

Furthermore, three Halloumi samples produced according to the traditional method, were characterized by an increased representation of the genera *Acinetobacter* and *Macroccoccus* and/or *Streptococcus*. These contaminants have been commonly detected in raw milk (Liu et al., 2015; Seon Kim et al., 2017) and cheeses, including Poro (Aldrete-Tapia, Escobar-Ramírez, Tamplin, & Hernández-Iturriaga, 2014), Danish (Masoud et al., 2011) and Pico cheese (Riquelme et al., 2015). The two *Macroccoccus* species detected, *M. caseolyticus* and *M. brunensis* are reported as able to breakdown casein, contributing to aroma precursors formation (Fuka et al., 2013). Finally, one sample produced according to the “traditional” way had elevated relative abundance of *Mycoplasma*, species of which may cause infections in sheep and goats (Woubit et al., 2007). Their existence in Halloumi may again be associated with improper pasteurization process, environmental contamination and unsuccessful storage conditions. Indicatively, analysis of Grana-like hard cheeses, showed that the use of natural whey

cultures rich in LAB during cheesemaking, did not suffice to prevent the development of spoilage bacteria in mature cheese, when raw cow's milk rich in contaminants and spoilage bacteria was used during manufacturing (Alessandria et al., 2016).

Noteworthy, the analysis included two mature Halloumi samples (G_2 and GS_8). Both samples were characterized by elevated relative abundance of LAB, such as *Lactobacillus*, *Leuconostoc*, *Pediococcus*, *Marinilactibacillus* and *Weissella*. Increased representation of *Lactobacillus plantarum*, *Leuconostoc mesenteroides* and *Weissella paramesenteroides* was also indicated in the long ripened traditional Mexican Cotija cheese (Escobar-Zepeda, Sanchez-Flores, & Quirasco Baruch, 2016). The process of ripening was additionally found to promote the dominance of LAB in three traditional Croatian ewe's milk cheeses, called Istrian, Krcki and Paski (Fuka et al., 2013). The increased proteolytic and lipolytic capacity as well as the ability of LAB bacteria to metabolize additional carbon sources, provides them the advantage to predominate the microenvironment of ripened cheeses (Kamilari et al., 2019). The degradation of those compounds during ripening, releases volatile organic compounds, contributing to different sensorial characteristics' development in mature, compare to fresh Halloumi samples (Papademas & Robinson, 2000).

5. Conclusion

This is the first study performed to characterize the bacterial communities of Cyprus Halloumi cheese via HTS. The study highlights the significant influence of the manufacturing method i.e. “traditional” versus “industrial”, in respect to Halloumi's established microbiome. The harsher heat treatments performed by industries could shape microbial communities. Additionally, the study proves that the microbiome could be used as a possible fingerprint for the characterization of the typicality of Cyprus Halloumi cheese. In the future, additional samples are to be analyzed in order to compare the microbiome of cheeses similar to Halloumi cheese possibly made in other countries. HTS analysis could be combined with additional methodologies, such as major and trace elements quantification via inductively coupled plasma–atomic emission spectroscopy (ICP-AES), an analysis that indicated significant differences in Halloumi cheese samples produced in different geographical areas (Osorio, Koidis, & Papademas, 2015), or isotopic analysis, in order to offer a more thorough characterization of the fingerprint of Cyprus Halloumi.

CRedit authorship contribution statement

Eleni Kamilari: Methodology, Formal analysis, Investigation, Data curation, Writing - original draft, Visualization. **Dimitrios A. Anagnostopoulos:** Methodology, Formal analysis, Investigation, Visualization. **Photis Papademas:** Methodology, Writing - review & editing. **Andreas Kamilaris:** Formal analysis, Visualization. **Dimitrios Tsaltas:** Conceptualization, Methodology, Formal analysis, Resources, Writing - review & editing, Supervision, Project administration, Funding acquisition.

Declaration of competing interest

The authors declare no conflict of interest.

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Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.lwt.2020.109298>.

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