

1 Interpretive Summary

2 Gagnon

3 Dairy farmers are commonly adding bacterial inoculants containing lactic acid bacteria
4 (LAB) in silage. However, the possible transfer of these LAB in milk could have a negative
5 influence on its quality. The aim of this study was to evaluate the impact of silage
6 inoculation on LAB profiles of raw milk. This study demonstrated the plausible transfer of
7 some LAB strains from silage to bulk tank milk. However, silage was a minor source of
8 LAB contamination for raw milk. Inoculation has a positive effect on the quality of grass
9 silage and seems to be an advantageous management practice for dairy farmers.

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LACTIC ACID BACTERIA FROM SILAGE IN BULK TANK MILK

Prevalence and abundance of lactic acid bacteria in raw milk associated with forage types in dairy cow feeding

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ABSTRACT

29 Lactic acid bacteria (**LAB**) found in milk can be responsible for organoleptic defects
30 in cheese. In order to identify the source of LAB that could potentially develop during
31 cheese making, we evaluated their prevalence and abundance in milk according to the type
32 of forage used in dairy cow feeding. Forages and bulk tank milk were sampled three times
33 on 24 farms using either hay alone (control), or grass or legume silage supplemented or not
34 with corn silage. Both types of silages were either noninoculated, or inoculated with
35 commercial preparations containing at least a *Lactobacillus buchneri* strain along with
36 *Lactobacillus casei*, *Lactobacillus plantarum*, *Enterococcus faecium*, or *Pediococcus*
37 *pentosaceus*. Our results indicate that LAB viable counts in milk samples (2.56 log cfu/mL)
38 did not differ according to the type of forage used. A total of 1239 LAB were isolated and
39 identified by partial 16S rRNA gene sequencing. Although inoculation increased
40 lactobacilli abundance in grass silage by 35%, we did not observe an effect on the LAB
41 profile of milk. Indeed, there was no significant difference in milk LAB prevalence and
42 abundance according to the type of forage ($P > 0.05$). Moreover, isolates belonging to the
43 *L. buchneri* group were rarely found in bulk tank milk (3/481 isolates). Random amplified
44 polymorphic DNA typing of 406 LAB isolates revealed the plausible transfer of some
45 strains from silage to milk (~6%). Thus, forage is only a minor contributor to LAB
46 contamination of milk.

47 **Key words:** silage, non-starter lactic acid bacteria, random amplification of polymorphic
48 DNA, bacteriocin

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INTRODUCTION

50

51 Raw milk is a complex matrix favorable to the development of microorganisms due to
52 its high nutrient content and water activity. Milk microbiota is composed of diverse
53 microorganisms belonging to fungi, bacteriophage, protists, archaea, and bacteria. Lactic
54 acid bacteria (**LAB**) are one of the most common types of microorganisms in milk (Quigley
55 et al., 2013). They are Gram-positive, oxidase and catalase-negative, asporogenous, and
56 belong to the order of *Lactobacillales* (Mattarelli et al., 2014). Many genera of LAB such
57 as *Lactococcus*, *Streptococcus*, *Lactobacillus*, *Leuconostoc*, and *Pediococcus* are well-
58 known because they are associated with the manufacturing of dairy products (Gobbetti et
59 al., 2018). Non-starter LAB (**NSLAB**) found in cheese can come directly from the milk
60 (Fox et al., 2017a; Desfossés-Foucault et al., 2013; Gobbetti et al., 2018). Indeed, they can
61 resist heat treatment of milk before cheese making (Fox et al., 2017b). Heterofermentative
62 NSLAB are occasionally responsible for cheese defects (Banks and Williams, 2004;
63 Ortakci et al., 2015). Moreover, LAB are usually able to produce bacteriocins against
64 closely related bacteria (Field et al., 2018). If NSLAB inhibit starters and adjunct cultures
65 during cheese manufacturing, it could cause defects in end-products. Hence, it is essential
66 to have a better understanding of the origin of NSLAB.

67 The origin of milk microbiota has been the subject of several recent scientific studies
68 (Gleeson et al., 2013; Driehuis, 2013; Skeie et al., 2019). It seems that all components of
69 the dairy farm environment, such as litter, milking systems, and cattle feeding influence
70 this microbiota. In Eastern Canada, silage is a key element for feeding dairy cows (Fadul-
71 Pacheco et al. 2017) and it is a potential contamination source of LAB for milk. It is
72 obtained by fermentation of forage in bunkers or silos by epiphytic LAB. The composition

73 of these LAB is modulated by silage crops (McAllister et al., 2018). Silage in Eastern
74 Canada endures a wide range of temperature and potentially could select for LAB able to
75 resist heat treatment in milk. In recent years, it has become common practice to add
76 bacterial inoculants in silage to improve its quality during storage. Facultative
77 heterofermentative LAB such as *Lactobacillus plantarum* or obligate heterofermentative
78 LAB such as *Lactobacillus buchneri* are often used (Muck et al., 2018). The *L. buchneri*
79 inoculant is beneficial as this species decreases yeast number in silage through a high
80 production of acetic acid (Dolci et al., 2011). While the impact of inoculants on silage
81 quality is well described (Tabacco et al., 2011; Schmidt and Kung, 2010; Contreras-Govea
82 et al., 2013), their direct impact on milk microbiota is not.

83 We hypothesized that there is a transfer of LAB from silage to milk, and that this
84 transfer is exacerbated when silages are treated with commercial LAB inoculants.
85 Therefore, this study investigated the impact of silage on raw-milk LAB prevalence and
86 abundance. Lactic acid bacteria shown to be able to carry over from dairy cow feeding to
87 milk were then isolated by a culture-dependent approach.

88 MATERIALS AND METHODS

89 *Farm Sampling*

90 ***Selection of herds.*** Commercial dairy farms (n = 24) in Quebec were recruited using
91 the list provided by the Canadian DHIA (Lactanet, Sainte-Anne-de-Bellevue, QC, Canada),
92 on which farmers consent for the sampling of forages and milk. Farms were divided into
93 five feeding types according to the forages used, representing the common feeding
94 practices in Eastern Canada (Figure 1). The first group was composed of farm using hay

95 (H; non fermented) as the sole source of forage, and was defined as control. The second
96 group was farms feeding grass or legume silage (GL). The third group used grass or legume
97 silage supplemented with corn silage (GLC). The fourth group used grass or legume silage
98 supplemented with corn silage that was inoculated at the time of harvest (GLCI). Finally,
99 the fifth group used grass or legume silage supplemented with corn silage, both inoculated
100 at the time of harvest (GLICI). The inoculants added by the dairy producers of the GLCI
101 and GLICI groups were those available on the market (Table 1), and included Biotal
102 Buchneri 500 and Biotal Supersile (Lallemand Animal Nutrition, Milwaukee, WI), 11CFT,
103 11C33, and 11G22 (Pioneer, Johnston, IA). None of these herds had access to pasture
104 during sampling periods.

105 *Sampling, Isolation, and Quantification of Lactic Acid Bacteria.* The dairy farms
106 were sampled three times (Figure 1). Between the first and second samplings, three farms
107 changed their feeding type. The farm 2H became 7GL, the farm 1GLCI became 7GLICI,
108 and the farm 2GLCI became 4GLC. At each site, forages and raw milk were collected.
109 Fermented forages were ensiled for at least 45 d before collections. All samples were
110 placed in a cooler at 4°C until analysis at the laboratory and were processed within 24 h.
111 Approximately 500 g of each forage were sampled directly from hay barns or silos. The
112 samples were taken with sterilized shovel, or probe (Prov-Vac, St-Jean-Chrysostome, QC,
113 Canada) for the baled material, and were transferred in a bag free from bacteria or other
114 living microorganisms. A first subsample was sent to Lactanet laboratories for near-
115 infrared reflectance spectroscopy analysis of DM and pH. A second subsample of 30 g was
116 placed in a Whirl-Pak bag with a filter (Nasco, Fort Atkinson, WI) and homogenized in
117 Stomacher 400 Circulator (Seward, West Sussex, UK) at 260 rpm for 5 min with 270 mL

118 of peptone-buffered saline containing 1 g/L of Bacto Peptone (BD Biosciences, San Jose,
119 CA) and 9 g/L of NaCl (Thermo Fisher Scientific, Waltham, MA). The mixture was diluted
120 in peptone-buffered saline for viable counts and plated on MRS agar with BromoPhenol
121 Blue (MilliporeSigma, St. Louis, MO) (**MRS-BPB**) for total LAB (Lee and Lee, 2008) and
122 a medium agar containing arginine (MilliporeSigma), bromocresol purple
123 (MilliporeSigma), beef extract (BD Biosciences), and vancomycin (Thermo Fisher
124 Scientific) (**ABEV** agar) for heterofermentative LAB (Sohier et al., 2012). However, viable
125 counts on ABEV agar were revealed to correspond to total LAB because color-based
126 distinction of homofermentative from heterofermentative colonies was difficult. The
127 identification of isolated bacteria has shown that we recovered both types of fermentative
128 LAB. Petri dishes for both media were incubated at 37°C for 48 h in an anaerobic glove
129 box containing an atmosphere of 80% N₂, 10% H₂, and 10% CO₂ (Praxair Canada,
130 Mississauga, ON, Canada).

131 The milk in the bulk tank was agitated for 5 min. Then, the tank tap was washed with
132 water. Approximately 10-mL of milk was first discarded, and the milk sample (100 mL)
133 was collected. From this sample, a 10-mL aliquot was homogenized in the Stomacher with
134 90 mL of 2% (w/v) sodium citrate (EMD Chemicals, Gibbstown, NJ) at 260 rpm for 5 min.
135 Viable counts in milk were performed as described for forages.

136 For first and second sampling periods, LAB were isolated from Petri dishes used for
137 viable counts with Harrison's disk to obtain representative isolates of the starting
138 population from forage and milk samples (Ricciardi et al., 2015). The selected colonies
139 were purified by plating on MRS-BPB agar and cultivated in MRS broth. The stock
140 cultures were frozen at -80°C supplemented with 20% (v/v) glycerol (EMD Chemicals).

141 The isolates were labeled RKG (Roy, Kennang, and Gagnon) and were numbered 1 or 2
142 according to the sampling period followed by the order they were isolated. Samples of the
143 commercial inoculants used on the farms were rehydrated in peptone-buffered saline and
144 plated on MRS-BPB agar. Colonies were selected, purified and frozen as described for
145 forage and milk samples, and were used to extract DNA for random amplification of
146 polymorphic DNA (**RAPD**).

147 *Bacterial Identification and Typing*

148 All selected isolates were identified by partial 16S rRNA gene sequencing. First,
149 genomic DNA was extracted with Geneaid Presto Mini gDNA Bacteria Kit (FroggaBio,
150 Toronto, ON, Canada) with modifications. Mutanolysin (50 U/mL; MilliporeSigma) was
151 added to the Gram+ buffer and the quantity of lysozyme was increased to 20 mg/mL.
152 Finally, all incubation times in the sample preparation steps were doubled. Yield and
153 quality of DNA were quantified by using a NanoDrop ND-1000 Spectrophotometer
154 (NanoDrop Technologies, Wilmington, DE). DNA was diluted to 25 ng/μL. The partial
155 amplification of the 16S rRNA gene (~800 bp) with the universal primers 27F (5'-
156 AGAGTTTGATCCTGGCTCAG-3') and 788R (5'-GGACTACCAGGGTATCTAA-3'),
157 as well as the Sanger sequencing were performed according to Gagnon et al. (2020).
158 Forward and reverse strand sequences were aligned with Geneious Pro R6 software
159 (Biomatters, San Francisco, CA). Phylogenetic affiliation of the isolates was determined
160 with the Nucleotide Basic Local Alignment Search Tool
161 (<https://blast.ncbi.nlm.nih.gov/Blast.cgi>). The 16S rRNA gene sequences are available in
162 GenBank under accession numbers MT044754 - MT045988.

163 Multiplex PCR assay targeting the housekeeping gene *recA* as described by Torriani et
164 al. (2001) was carried out for better identification of isolates belonging to the *L. plantarum*
165 group (*L. plantarum*, *L. paraplantarum*, and *L. pentosus*). The PCR amplification was
166 performed with a Tgradient (Biometra, Montreal Biotech, Montreal, QC, Canada).
167 Conditions and primers for PCR are presented in Supplemental Tables S1 and S2. The PCR
168 products (*L. plantarum*: 318 bp, *Lactobacillus paraplantarum*: 107 bp, and *Lactobacillus*
169 *pentosus*: 218 bp) were migrated through 2% agarose gel submerged in sodium boric acid
170 buffer for 30 min at 135 mV. Positive controls were *L. plantarum* ATCC 14917 and
171 *L. pentosus* ATCC 8041. Nuclease-free water was used as negative control.

172 A selection of LAB that could originate from silage was included for typing. For each
173 farm, isolates of the same species collected both in forages and raw milk were selected
174 (Figure 1). For example, if on a given farm, *L. plantarum* were isolated in milk, then all
175 isolates from milk, forages, and the corresponding inoculants from this farm were typed.
176 The RAPD with the M13 primer (5'-GAGGGTGGCGGTTCT-3'), as described by Ruiz et
177 al. (2014), was used as a typing method. The PCR conditions are presented in Supplemental
178 Tables S3 and S4. The band patterns obtained after migration at 135 mV during 60 min in
179 a 2% agarose gel were normalized and compared with GelJ V.2.0 software (Heras et al.,
180 2015). The similarity between isolates was determined by Pearson's Correlation Method
181 (a coefficient working with the densitometric curve associated with the different lanes) and
182 the clustering was performed by Unweighted pair group method with arithmetic mean. The
183 genotype was defined at a minimum level of 80% similarity.

184 ***Antibacterial Agar Diffusion Assay***

185 Antibacterial activity against indicator spoilage bacteria and cheese starters were
186 screened for all isolates using the agar well diffusion method described by Fernandez et al.
187 (2013). Briefly, after two subcultures, indicator strains were grown overnight in their
188 optimal broth: Tryptic Soy Broth (BD Biosciences) with 0.6% yeast extract (Thermo Fisher
189 Scientific) for *Listeria ivanovii* HPB28, Reinforced Clostridial Medium (HiMedia
190 Laboratories LLC, West Chester, PA) for *Clostridium tyrobutyricum* ATCC 25755, Elliker
191 (BD Biosciences) for *Lactococcus lactis* spp. *cremoris* SK11 and MRS for *Lactobacillus*
192 *paracasei* ATCC 334. Then, inoculation at 0.6% on the same media with 0.75% agar was
193 performed. Wells were dug in inoculated solidified agar plates, and 80 μ L aliquot of isolate
194 supernatant were added. The supernatant of overnight culture in MRS was obtained after
195 centrifugation (10,000 $\times g$, 10 min at 4°C). The plates were incubated 24 h at 37°C (under
196 anaerobic conditions for *C. tyrobutyricum*). After incubation, inhibition zone diameters
197 were measured. Bacteriocin-containing culture supernatants produced clear inhibition
198 zones featuring well-defined margins with a diameter greater than 8 mm (Supplemental
199 Figure S1). The positive controls used were supernatants of *Pediococcus acidilactici* UL5
200 producing pediocin PA-1, *L. lactis* ATCC 11454 producing nisin A, and *Escherichia*
201 *coli* MC 4100 producing microcin J25.

202 ***Statistical analysis***

203 Student's t-test, ANOVA, and Tukey's multiple comparisons or Honestly significant
204 difference test on viable counts were used for data with normal distribution and equal
205 variances. Otherwise, counts were analyzed with nonparametric Kruskal-Wallis-Wilcoxon
206 test. Statistical analysis was performed with JMP version 14 Software (SAS Institute, Cary,
207 NC). Data of taxonomic group relative abundances were transformed in the R environment

208 (R Core Team, 2013) using Phyloseq (McMurdie and Holmes, 2013) and Microbiome
209 (Lahti and Shetty, 2017) packages. Relative abundances were then compared with STAMP
210 version 2.1.3 (Parks et al., 2014). Significance was assessed using an ANOVA comparing
211 multiple groups and Storey's FDR correction was applied to *P*-values.

212 RESULTS

213 *Lactic Acid Bacteria Prevalence and Abundance in Forages*

214 The characteristics of forages were different according to their type (Supplemental
215 Table S5). In particular, the pH of C silage was lower than GL silage, but inoculation did
216 not affect this parameter. The MRS-BPB agar was not specific for LAB (Supplemental
217 Table S6); therefore, only viable counts obtained on the ABEV medium are presented. The
218 LAB viable counts for H were lower (2.15 ± 1.83 log cfu/g) than both inoculated and non-
219 inoculated silages (C + CI: 7.25 ± 1.30 log cfu/g; GL + GLI: 6.79 ± 1.05 log cfu/g; *P*
220 < 0.01; Figure 2). Inoculated silage LAB viable counts were greater than non-inoculated
221 silage only at the second sampling period (C vs. CI: *P* < 0.02; GL vs. GLI: *P* < 0.01).

222 A total of 758 LAB were isolated in forages from the first two sampling periods. They
223 belonged to 42 taxa corresponding to six genera, e.g., *Enterococcus*, *Lactobacillus*,
224 *Lactococcus*, *Leuconostoc*, *Pediococcus*, and *Weissella* (Figure 3A). Statistical analyses
225 performed with STAMP indicated that LAB profiles differed between H and silages. At
226 the genus level, the difference in mean proportions of *Enterococcus* spp. and *Leuconostoc*
227 spp. were respectively 20 and 15% more abundant in H than silages (Figure 4A). The
228 relative abundance of *Lactobacillus* spp. was greater in silages than in H. *Lactobacillus*
229 was the dominant genus in both grass or legume silage (GL + GLI: 72%) and corn silage

230 (C + CI: 93%). At the species level, there were also significant features characterizing the
231 forages (Figure 4B). *Enterococcus mundtii*, *L. pentosus*, *Lactobacillus tucseti*, *L. lactis*,
232 and *Leuconostoc mesenteroides/pseudomesenteroides* were specific to H. The *L. buchneri*
233 group was a specific and a dominant taxon in silages whether inoculated or not (Figures 3B
234 and 4B). Its relative abundance in grass or legume (GL + GLI) and corn (C + CI) silage
235 samples was 48 and 38%, respectively. *Lactobacillus brevis/yonginensis/koreensis* was
236 also found in silage, but it was more abundant in corn than grass or legume (C + CI: 11%
237 vs. GL + GLI: 5%) silage. *Pediococcus pentosaceus* was more abundant in H (20%) and
238 grass or legume (GL + GLI: 12%) than corn (C + CI: 1.5%). Finally, *Lactobacillus*
239 *casei/paracasei* and *L. plantarum* were not exclusive to any forage type (Figure 3A). The
240 prevalence and the abundance of LAB did not differ between C and CI silage samples.
241 However, the relative abundance of specific genera was different between GL and GLI
242 silage (Figure 5), particularly *Lactobacillus*, *Pediococcus*, and *Weissella* for the first two
243 sampling periods. *Lactobacillus* spp. were 35% more abundant in GLI silage. On the other
244 hand, *Pediococcus* spp. and *Weissella* spp. were more abundant in the GL silage. The LAB
245 profile of GL silage samples was intermediate between H profiles and other silages. Indeed,
246 as for hay, GL silage bacteria consisted of *Weissella paramesenteroides/thailandensis* and
247 *P. pentosaceus* in high proportions, and enterococci were present. In addition, GL silage
248 contained a high proportion of the *L. buchneri* group, similar to GLI, C and CI samples.

249 ***Lactic Acid Bacteria Prevalence and Abundance in Bulk Tank Raw Milk***

250 There was no effect of sampling periods on LAB viable counts in bulk tank milk
251 samples ($F = 0.32$; $P < 0.73$), the mean concentration being 2.56 ± 1.04 log cfu/mL. Viable
252 counts of LAB differed among milk samples (~ 1 log cfu/mL) according to farm feeding

253 types ($F = 5.16$; $P < 0.005$; Figure 6). Milk from the GLICI group of farms contained
254 significantly more LAB (3.22 ± 0.82 log cfu/mL) than GL (2.20 ± 0.58 log cfu/mL) and H
255 (2.16 ± 1.38 log cfu/mL) groups.

256 For the first two samplings, 481 isolates of LAB were recovered from bulk tank raw
257 milk samples. A total of 12 isolates of *Streptococcus* (*S. equinus/lutetiensis*,
258 *S. macedonicus/gallolyticus*, *S. parauberis*, *S. sanguinis*, and *S. uberis*) were not compiled
259 in LAB profiles as they are usually associated with mastitis and they are not found in forage
260 (Cameron et al., 2016). The remaining 469 LAB isolates belong to 39 taxa (Figure 3B).
261 Genera identified were the same as those found in forage i.e., *Enterococcus*, *Lactobacillus*,
262 *Lactococcus*, *Leuconostoc*, *Pediococcus*, and *Weissella*. Even though there were
263 significant differences in LAB profile among forage types, the difference was not so
264 obvious for the milk types. *L. casei/paracasei* was the most abundant group, representing
265 25% of total. *Leuconostoc lactis/garlicum*, *P. pentosaceus*, *L. lactis*,
266 *W. paramesenteroides/thailandensis*, *Lactobacillus parabuchneri*, and *L. plantarum* were
267 also found in abundance in the different milk samples. Only three isolates belonging to the
268 *L. buchneri* group were identified in all samples of milk (Figure 3B). One farm remained
269 in GLICI category at the second sampling period where only *P. pentosaceus* isolates were
270 identified. Lastly, the multiple comparison of relative abundance at genus- and species-
271 levels identified only one significant difference in bulk tank milk samples according to the
272 feeding types. The relative abundance of *Pediococcus parvulus* was greater (3.1%) in
273 GLICI-milk samples than in milk from the other feeding types. However, only one milk
274 sample contained *P. parvulus* (12%) in this group, and in other milk samples.

275 ***Screening for Bacteriocin Activity***

276 Out of 1239 isolates collected during this study and from the commercial inoculants,
277 36 culture supernatants had a strong antibacterial activity against *L. ivanovii* HPB28
278 corresponding to a bacteriocin effect (Table 2). Most of these supernatants (64%) came
279 from the *L. plantarum* group isolates. Half of those also inhibited the growth of
280 *L. lactis* subsp. *cremoris* SK11. A total of 20 *Lactococcus* spp. also had a bacteriocin-like
281 inhibitory effect on *L. lactis* subsp. *cremoris* SK11. Only *L. lactis* RKG 2-85 inhibited
282 *C. tyrobutyricum* ATCC 25755 growth. Of all isolates exhibiting bacteriocin activity, 77%
283 were isolated from milk. None of the culture supernatants exhibited a bacteriocin-like
284 activity against *L. paracasei* ATCC 334. None of isolates from commercial inoculants had
285 a bacteriocin-like inhibitory effect.

286 ***Typing of Bacteria Potentially Transferred from Forage to Milk***

287 For each farm, isolates belonging to the same species, and shared in both milk and
288 forages were typed. Out of 481 milk isolates, 172 were part of at least one forage or
289 commercial inoculant and belonged to 18 taxa (Table 3). The 172 RAPD patterns were
290 compared by species for each farm with Pearson's correlation analysis. Thus,
291 65 dendrograms were produced (Supplemental Figure S2). We identified 36 isolates (7%)
292 more likely to be transferred from silage to milk as they shared more than 80% similarity
293 (Table 4). Among these 36 isolates, few belonged to the same lineage; corresponding to
294 31 strains, which can be divided in nine taxonomic groups, i.e. *E. mundtii* (1), *L. brevis*
295 group (1), *L. buchneri* group (1), *L. casei/paracasei* (5), *L. paraplantarum* (1),
296 *L. plantarum* (5), *L. tuccei* (1), *P. pentosaceus* (9), and *W. paramesenteroides* group (7).
297 They were associated with the five type of forages (H: 8 strains; GL: 8 strains; GLI:
298 4 strains; C: 4 strains; CI: 5 strains). Moreover, five strains were highly similar to

299 commercial inoculants. Screening for bacteriocin activity supports the possibility of a
300 transfer from silage to raw milk of the strains RKG 2-212 and 2-227, as they both produced
301 an antibacterial effect on *L. ivanovii* HPB28 and had 94% similarity. Bacteriocin screening
302 also confirmed that four of these strains (RKG 1-375, 1-378, 1-380, and 1-500) did not
303 come from forages or commercial inoculants because they had inhibitory activity on
304 *L. ivanovii* HPB28, but not their corresponding isolates. Regarding inhibitory activity
305 results, 27 strains were shared between silage and bulk tank raw milk.

306

DISCUSSION

307 In the present study, LAB presence in Eastern Canadian farm-scale silage samples were
308 in agreement with a meta-analysis by Oliveira et al. (2017). The LAB count mean for non-
309 inoculated silage were 7.04 log cfu/g, regardless of the forage type. Our results are also
310 similar to data reported previously from Italian farms (Rossi and Dellaglio, 2007). In that
311 study, LAB viable counts for corn and alfalfa non-inoculated farm-made mature silage
312 were respectively 7.71 and 6.71 log cfu/g. Our LAB viable counts in C silage are also
313 similar to Blajman et al. (2018) meta-analysis. According to their investigation, the mean
314 LAB counts were 7.27 and 6.40 log cfu/g for inoculated and non-inoculated silage,
315 respectively. In our work, unlike Reich and Kung (2010) and Guo et al. (2018), LAB viable
316 counts were not much greater in inoculated than in non-inoculated silage samples. However,
317 their studies were performed in lab-made instead of farm-made silage.

318 The LAB communities differed according to forage types (Figures 3, 4 and 5). Indeed,
319 enterococci were associated with H and GL silage. They are known to be epiphytic in fresh
320 alfalfa crops but are diminished during ensiling when *Lactobacillus* are growing (Yang et

321 al., 2019; Guo et al., 2018). *E. mundtii* was found specifically in association with H. This
322 species was found to be epiphytic on fresh grass and legume crops (Guo et al., 2018; Muller
323 et al., 2001). The greater relative abundance of *Enterococcus* spp. in H can be linked to
324 their capacity to survive a long period under dry conditions (Wendt et al., 1998). Likewise,
325 *Lactococcus lactis* abundance in H was probably due to their ability to survive high
326 osmolarity and dehydration (Sanders et al., 1999). In the present study, *Leuconostoc*
327 *mesenteroides/pseudomesenteroides* was also retrieved from H. Lin et al. (1992) found
328 *L. mesenteroides* on fresh alfalfa and corn plants, but not after ensiling. This species can
329 initiate the fermentation of forage, but it is not as acidotolerant as *Lactobacillus* spp.
330 (Holzer et al., 2003). Past studies also showed the dominance of lactobacilli in corn and
331 grass silage materials, between 50 and 98% (Yang et al., 2019; Hu et al., 2018; McAllister
332 et al., 2018). *L. brevis*, *L. plantarum*, and *L. buchneri* are known to tolerate high acidity
333 (Dunière et al., 2013). The *L. buchneri* group was the dominant species in silage, inoculated
334 or not. Similar to the present study, Stevenson et al. (2006) showed that its relative
335 abundance in inoculated alfalfa silage was comparable to the non-inoculated silage.
336 *L. buchneri* became the dominant LAB in mature silage samples (Zhou et al., 2016; Muck
337 et al., 2018). Genomic, transcriptomic and proteomic analysis of this species demonstrated
338 its resistance against competing microorganisms by different mechanisms such as the
339 production of lactic acid, acetic acid, and hydrogen peroxide (Heinl and Grabherr, 2017).
340 Compared to the majority of LAB, this species can use lactic acid as an energy source
341 (Muck et al., 2018), explaining its dominance in silage when the water-soluble
342 carbohydrates are low. The *L. brevis* taxon was commonly found in grass and corn silage
343 (Dunière et al., 2013). In our study, this obligate heterofermentative group was more

344 abundant in C silage than in GL silage. The pH of C silage was lower than GL silage and,
345 as previously mentioned, *L. brevis* is an acidotolerant species. Furthermore, it was more
346 abundant in the fall sampling. It could be linked to the warmer temperature, as Zhou et al.
347 (2016) found a greater abundance of *L. brevis* when corn was ensiled between 15 and 25°C
348 in comparison to 5 and 10°C.

349 The LAB profile did not differ between C- and CI-silage samples. This could be
350 explained by the lower buffering capacity of corn as compared with alfalfa (Queiroz et al.,
351 2018). Therefore, pH will decrease easily in both C and CI silage samples, quickly
352 promoting acidotolerant lactobacilli. In their meta-analysis on inoculation with
353 homofermentative and facultative heterofermentative LAB from silage materials, Oliveira
354 et al. (2017) also demonstrated that the inoculation effect depends on the forage plants.
355 Inoculation at harvest improved fermentation of grass and legumes silage, but not of corn
356 silage. In our study, GL silage and H showed similarities, such as a high relative abundance
357 of *P. pentosaceus* and *W. paramesenteroides/thailandensis*. *P. pentosaceus* is not
358 exclusively epiphytic on grass and legume crops. Indeed, its proportion on alfalfa and corn
359 were shown to be similar (Lin et al., 1992; Cai et al., 1999). When GL silages were
360 inoculated, the relative abundance of *P. pentosaceus* decreased. Stevenson et al. (2006) and
361 Yang et al. (2019) demonstrated similar results with a greater abundance of *Pediococcus*
362 spp., *Enterococcus* spp., and *Weissella* spp. in non-inoculated alfalfa silage.

363 Even though LAB profile and concentration vary according to forage types, these
364 differences were not reflected in raw milk. The concentration of LAB in raw milk is in
365 agreement with data found in literature, which is to say between 10¹ CFU/mL and
366 10⁴ CFU/mL (Quigley et al., 2013). *L. casei/paracasei* was the dominant LAB in raw milk,

367 as found by Vacheyrou et al. (2011) on French farms. This species and the other dominant
368 LAB (*L. casei/paracasei*, *L. lactis/garlicum*, *P. pentosaceus*,
369 *W. paramesenteroides/thailandensis*, *L. lactis*, *L. parabuchneri*, and *L. plantarum*) are
370 often part of the NSLAB in cheese (Quigley et al., 2011; Fox et al., 2017a). We expected
371 to find more *L. buchneri* in milk samples from silage fed herds as it was dominant in
372 fermented forage and has already been found in cheese (Desfossés-Foucault et al., 2013;
373 Blaya et al., 2018). However, this taxon was rarely isolated in raw milk. Its resistance
374 mechanisms such as the use of lactic acid as an energy source and acid tolerance are not
375 operational selective measures in raw milk compared to silage.

376 Silage has previously been identified as a critical contamination source of bacterial
377 spores for milk (te Giffel et al., 2002; Driehuis et al., 2016). However, our RAPD typing
378 results suggested that only a few LAB strains probably originating from silage were
379 recovered in raw milk. Therefore, the use of silage did not seem to be the major
380 contamination source of LAB in raw milk. Our study did not allow us to identify how this
381 contamination occurred. It could be through transmission in the barn by direct contact of
382 forages with cow's hair and skin, including udder and teats, or through fecal contamination.
383 For example, spores from silage were previously found in cow feces suggesting their
384 resistance to digestion (Driehuis et al., 2016). Spores are probably more resistant than
385 bacteria to the conditions encountered on farms, particularly during ensiling, feeding and
386 milking. Teat canals of dairy cows can contain LAB (Bouchard et al., 2015) although they
387 are not in the principal bacteria of bovine mammary microbiota (Falentin et al., 2016).

388 Metagenomic analysis suggested that lactobacilli are niche specialists (Stefanovic et
389 al., 2017). Their adaptation to specific niches such as milk result in the acquisition of new

390 genes by horizontal transfer and the loss of coding sequences that are not needed. Their
391 survival capacity in environmental niches such as plant are reduced. This could explain
392 that few forage isolates were collected in milk. Also, LAB specific to forage niche could
393 lack genes important for intestinal tract survival. Therefore, their transfer opportunities
394 from feces to milk should be reduced. The strains that seem adapted to silage and milk
395 belonged to *L. casei/paracasei*, *L. plantarum*, *P. pentosaceus* and the
396 *W. paramesenteroides* group. Stefanovic and McAuliffe (2018) demonstrated
397 heterogeneity in the genome of three *L. paracasei* strains isolated in the same niche
398 (Cheddar cheese). They were able to link the genome of one strain to a prior plant-based
399 niche. In the case of *L. plantarum*, strains from different niches (insect gastrointestinal
400 tracts, human feces, olives, fruits, sourdoughs, and cheese) were modulating their
401 transcriptome to adapt to MRS medium (Filannino et al., 2018). Little information is
402 available on the genomics of *P. pentosaceus* and *W. paramesenteroides/thailandensis* as
403 well as their adaptation to ecological niches such as silage and milk.

404 In the present study, LAB prevalence and abundance in raw milk samples from farms
405 using silage inoculated with *L. buchneri* was not different from other feeding types.
406 Moreover, RAPD typing and the bacteriocin-screening eliminated all but two milk strains
407 that can be linked to commercial inoculants. Therefore, this management practice should
408 not negatively impact cheese making. In addition, this practice could be endorsed for the
409 limitation of enterococci in GL silage types. *Enterococcus* spp. are known to be
410 thermoresistant (Gagnon et al., 2020) and can cause defects during cheese making (Giraffa,
411 2003). More attention should be addressed, however, to the *L. casei/paracasei* and
412 *L. plantarum* inoculants. These facultative heterofermentative species seem more adapted

413 to diverse ecological niches and are commonly found as NSLAB in cheese (Blaya et al.,
414 2018; Stefanovic and McAuliffe, 2018). Moreover, some strains of *L. plantarum* isolated
415 from silage were also able to inhibit the starter *L. lactis* subsp. *cremoris* SK11. The
416 presence of those NSLAB could reduce starter activity and thus affect milk acidification
417 during cheese manufacture.

418 CONCLUSIONS

419 Even though LAB prevalence and abundance differed according to forage type, this
420 was not the case for bulk tank milk samples. The findings presented in this study confirm
421 that silage is a minor source of contamination of LAB for raw milk. Out of 481 milk isolates,
422 27 strains could be associated with silage. They belong in majority to four taxonomic
423 groups, i.e., *L. casei/paracasei*, *L. plantarum*, *P. pentosaceus*, and *W. paramesenteroides*.
424 These strains should be investigated further for their heat resistance and their potential
425 impact on cheese making. Finally, only two strains could originate from commercial
426 inoculants and they were not identified as *L. buchneri*. Therefore, inoculation of silage with
427 *L. buchneri* did not seem to increase milk contamination with obligate heterofermentative
428 LAB.

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651

652 **TABLES**653 **Table 1.** Description of commercial inoculants used on the dairy farms

Feeding type ¹	Farm number ²	Inoculant ³	Species in the inoculants				
			<i>Lactobacillus buchneri</i>	<i>Lactobacillus casei</i>	<i>Lactobacillus plantarum</i>	<i>Enterococcus faecium</i>	<i>Pediococcus pentosaceus</i>
GLCI	1	4	x		x	x	
	2	3	x	x	x		
	3	1	x				x
GLICI	1	1 and 2	x		x		x
	2	1	x				x
	3	1 and 3	x	x	x		x
	4	1	x				x
	5	1	x				x
	6	3 and 5	x	x	x	x	
	7	4 and 5	x		x	x	

654 ¹GLCI = Grass or legume silage, and corn silage inoculated; GLICI = Grass or legume silage
655 inoculated, and corn silage inoculated.

656 ²Farms were numbered sequentially within each feeding group.

657 ³1 = Biotol Buchneri 500, and 2 = Biotol Supersile (Lallemand Animal Nutrition, Milwaukee,
658 WI); 3 = 11CFT, 4 = 11C33, and 5 = 11G22 (Pioneer, Johnston, IA).

659

660 **Table 2.** Culture supernatants that have bacteriocin activity against *Listeria*
661 *ivanovii* HPB28, *Lactococcus lactis* subsp. *cremoris* SK11, or *Clostridium*
662 *tyrobutyricum* ATCC 25755

RKG Isolate ¹	Taxonomic group	Feeding type ²	Farm number ³	Matrix ²	Activity against		
					HPB28	SK11	ATCC 25755
2-118	<i>Lactococcus lactis</i>	H	1	Milk		x	
2-124	<i>Lactococcus lactis</i>	H	1	Milk		x	
1-174B	<i>Lactobacillus plantarum</i>	H	2	H	x	x	
1-176	<i>Lactobacillus plantarum</i>	H	2	H	x		
1-175	<i>Pediococcus pentosaceus</i>	H	2	H	x		
1-174A	<i>Pediococcus pentosaceus</i>	H	2	H	x		
2-85	<i>Lactococcus lactis</i>	H	4	Milk	x	x	x
1-205	<i>Lactococcus lactis</i>	H	5	H		x	
1-135	<i>Lactococcus lactis</i>	H	6	Milk		x	
1-136	<i>Lactococcus lactis</i>	H	6	Milk		x	
1-138	<i>Lactococcus lactis</i>	H	6	Milk		x	
2-705	<i>Leuconostoc mesenteroides</i>	GL	7	H ⁴		x	
2-707	<i>Leuconostoc mesenteroides</i>	GL	7	H ⁴		x	
2-760	<i>Lactobacillus plantarum</i>	GL	7	Milk	x	x	
2-759	<i>Lactococcus lactis</i>	GL	7	Milk		x	
1-77	<i>Lactobacillus paraplantarum</i>	GL	1	Milk	x		
2-361	<i>Lactobacillus plantarum</i>	GL	1	Milk	x		
2-172	<i>Pediococcus pentosaceus</i>	GL	2	Milk		x	
2-181	<i>Lactobacillus casei/paracasei</i>	GL	2	Milk		x	
2-182	<i>Lactobacillus casei/paracasei</i>	GL	2	Milk		x	
1-243	<i>Pediococcus stilesii</i>	GL	3	Milk	x	x	
2-582	<i>Lactobacillus pentosus</i>	GL	3	Milk	x		
2-571	<i>Lactobacillus plantarum</i>	GL	3	Milk	x		
2-567	<i>Lactococcus raffinolactis</i>	GL	3	Milk		x	
2-572	<i>Lactococcus lactis</i>	GL	3	Milk		x	
2-574	<i>Lactococcus raffinolactis</i>	GL	3	Milk		x	
2-770	<i>Lactococcus lactis</i>	GL	4	Milk		x	
2-771	<i>Lactococcus lactis</i>	GL	4	Milk		x	
2-413	<i>Enterococcus mundtii</i>	GL	5	GL	x		
1-103	<i>Pediococcus pentosaceus</i>	GL	5	Milk	x		
1-541	<i>Pediococcus acidilactici</i>	GL	6	Milk	x		
2-433	<i>Lactococcus lactis</i>	GLC	2	Milk		x	
2-436	<i>Lactococcus lactis</i>	GLC	2	Milk		x	
2-212	<i>Lactobacillus plantarum</i>	GLC	4	Milk	x	x	
2-213	<i>Lactobacillus paraplantarum</i>	GLC	4	Milk	x		
2-229	<i>Lactobacillus plantarum</i>	GLC	4	C	x	x	

2-227	<i>Lactobacillus plantarum</i>	GLC	4	C	x	x
1-613	<i>Lactobacillus plantarum</i>	GLC	3	Milk	x	x
1-615	<i>Lactococcus lactis</i>	GLC	3	Milk		x
1-616	<i>Lactococcus lactis</i>	GLC	3	Milk		x
1-618	<i>Lactococcus lactis</i>	GLC	3	Milk		x
1-619	<i>Lactococcus lactis</i>	GLC	3	Milk		x
1-634	<i>Lactobacillus plantarum</i>	GLC	3	C	x	x
1-593	<i>Lactococcus lactis</i>	GLCI	1	Milk		x
1-592	<i>Lactococcus lactis</i>	GLCI	1	Milk		x
1-506	<i>Lactobacillus plantarum</i>	GLCI	2	Milk	x	x
1-500	<i>Lactobacillus plantarum</i>	GLCI	2	Milk	x	
1-478	<i>Lactobacillus plantarum</i>	GLCI	3	Milk	x	
2-664	<i>Lactobacillus plantarum</i>	GLICI	1	GLI	x	x
1-378	<i>Pediococcus pentosaceus</i>	GLICI	1	Milk	x	x
1-380	<i>Lactobacillus paraplantarum</i>	GLICI	1	Milk	x	x
1-371	<i>Lactobacillus plantarum</i>	GLICI	1	Milk	x	
1-375	<i>Lactobacillus plantarum</i>	GLICI	1	Milk	x	
2-726	<i>Enterococcus faecium</i>	GLICI	1	Milk	x	
2-336	<i>Lactobacillus zeae</i>	GLICI	2	Milk	x	
2-468	<i>Lactobacillus delbrueckii</i>	GLICI	3	Milk		x
2-471	<i>Lactobacillus delbrueckii</i>	GLICI	3	Milk		x
1-381	<i>Lactobacillus paraplantarum</i>	GLICI	4	CI	x	x
1-254	<i>Pediococcus acidilactici</i>	GLICI	4	Milk	x	
2-33	<i>Lactobacillus plantarum</i>	GLICI	5	GLI	x	
1-193	<i>Lactococcus lactis</i>	GLICI	6	Milk		x
1-196	<i>Lactobacillus casei/paracasei</i>	GLICI	6	Milk		x
2-297	<i>Lactobacillus casei/paracasei</i>	GLICI	6	Milk	x	
1-178	<i>Lactobacillus plantarum</i>	GLICI	6	CI	x	x

663 ¹ The isolates were labeled RKG (Roy, Kennang, and Gagnon) and were numbered 1 or 2
664 according to the sampling period followed by the order they were isolated.

665 ²H = Hay; GL = Grass or legume silage; C = Corn silage; GLI = Grass or legume silage,
666 inoculated; CI = Corn silage, inoculated.

667 ³Farms were numbered sequentially within each feeding group.

668 ⁴Hay sample from farm 7GL.

669 **Table 3.** Number of milk isolates belonging to species also collected in forages or
 670 commercial silage inoculants on a given farm

Feeding type ¹	Farm number ²	<i>Enterococcus casseliflavus</i> group	<i>Enterococcus faecalis</i> group	<i>Enterococcus mundtii</i>	<i>Lactobacillus acidipiscis</i> group	<i>Lactobacillus brevis</i> group	<i>Lactobacillus buchneri</i> group	<i>Lactobacillus casei/paracasei</i>	<i>Lactobacillus coryniformis</i>	<i>Lactobacillus paraplanarium</i>	<i>Lactobacillus plantarum</i>	<i>Lactobacillus tuccei</i>	<i>Lactobacillus versmoldensis</i> group	<i>Lactococcus lactis</i>	<i>Leuconostoc mesenteroides</i> group	<i>Pediococcus parvulus</i>	<i>Pediococcus pentosaceus</i>	<i>Weissella hellenica/bombi</i>	<i>Weissella paramesentoides</i> group
H	1			1														1	
	2							2		1					5		3		2
	3	1		2				1									1		
	4							7											
	5							3				1		1			1		6
	6																	4	1
GL	1					1			1	1							1		4
	2																5		2
	3										1						1		2
	4													2			1		2
	5																5	1	
	6							13											
GLC	1						1												
	2		4								1								
	3							5			1								
	4										2								
GLCI	1		1					5			1								
	2							2			2					1			4
	3										1		1				10		
GLICI	1							1	1	1	2						2		2
	2				1		1	3											
	3					1											2		
	4																2		
	5							9											
	6					1		14											
Total		1	5	3	1	3	2	65	2	1	13	1	1	3	5	1	39	1	25

671 ¹H = Hay; GL = Grass or legume silage; C = Corn silage; GLI = Grass or legume silage, inoculated;
 672 CI = Corn silage, inoculated.

673 ²Farms were numbered sequentially within each feeding group.

Table 4. Relationship of milk isolates with forage isolates or commercial silage inoculants

Farm number ¹	Feeding type ²	Taxa	Milk isolate ^{3,4}	Forage/Inoculant isolate ⁵	Sample type ²	Similarity (%) ⁶		
1	H	<i>Pediococcus pentosaceus</i>	2-121	1-161	H	83		
				1-162	H	84		
2	H	<i>Lactobacillus casei/paracasei</i>	2-748*	1-658A	H	90		
				1-658A	H	90		
		<i>Weissella paramesentoides</i> group	1-173*	2-704	H	91		
			2-757*	2-704	H	91		
3	H	<i>Enterococcus mundtii</i>	2-102	2-95B	H	92		
5	H	<i>Lactobacillus tuccei</i>	1-198	1-206	H	94		
				<i>Weissella paramesentoides</i> group	2-630	2-625	H	90
					2-635	1-208	H	96
6	H	<i>Pediococcus pentosaceus</i>	1-141*	2-811	H	91		
				1-142*	2-811	H	84	
				2-802*	2-811	H	89	
1	GL	<i>Pediococcus pentosaceus</i>	1-74	2-379	GL	84		
				2-380	GL	85		
				2-383	GL	85		
3	GL	<i>Weissella paramesentoides</i> group	1-240	2-552	GL	95		
				2-555	GL	90		
				2-547	GL	81		
				2-581	GL	99		
				2-555	GL	96		
4	GL	<i>Pediococcus pentosaceus</i>	2-777	1-406	GL	82		
				1-414	GL	87		
				1-418	GL	96		
5	GL	<i>Pediococcus pentosaceus</i>	2-399	1-83	GL	80		
2	GLC	<i>Lactobacillus plantarum</i>	2-439	2-449	C	80		
3	GLC	<i>Lactobacillus casei/paracasei</i>	1-623	1-640	C	89		
				2-69	1-629	GL	86	
				1-631	GL	85		
4	GLC	<i>Lactobacillus plantarum</i>	2-211	2-219	C	86		
				2-222	C	90		
				2-227	C	93		
				2-219	C	85		
				2-222	C	91		
				2-227	C	94		
1	GLICI	<i>Lactobacillus casei/paracasei</i>	2-719	2-675	CI	95		
		<i>Lactobacillus paraplantarum</i>	1-380	2-668	GLI	82		
		<i>Lactobacillus plantarum</i>	1-375	2-671	GLI	84		

				1-351	CI	82
				Ino2C	INO	88
				Ino2G	INO	84
		<i>Pediococcus pentosaceus</i>	1-374	Ino1E	INO	81
			1-378	Ino1E	INO	81
		<i>Weissella paramesentoides</i> group	2-708	2-674	CI	97
2	GLICI	<i>Lactobacillus buchneri</i> group	1-227	2-325	GLI	85
				2-329	GLI	92
				1-300	CI	81
				1-301	CI	83
				1-302	CI	85
3	GLICI	<i>Pediococcus pentosaceus</i>	2-474	Ino1C	INO	81
				Ino1E	INO	88
5	GLICI	<i>Lactobacillus casei/paracasei</i>	1-88*	1-89	GLI	88
			2-1*	1-89	GLI	80
6	GLICI	<i>Lactobacillus brevis</i> group	1-189B	1-180A	CI	92
2	GLCI	<i>Lactobacillus plantarum</i>	1-500	Ino3A	INO	85
				Ino3E	INO	89
				Ino3L	INO	88
		<i>Weissella paramesentoides</i> group	1-502	1-510B	GL	81
3	GLCI	<i>Pediococcus pentosaceus</i>	1-534	2-263	GL	89

676 ¹Farms were numbered sequentially within each feeding group.

677 ²H = Hay; GL = Grass or legume silage; C = Corn silage; GLI = Grass or legume silage,
678 inoculated; CI = Corn silage, inoculated; INO = Commercial inoculant.

679 ³Isolates identified with a star (*) belong to the same strain on the same row.

680 ⁴Codes of isolates producing antibacterial activity against *Listeria ivanovii* HPB28 are in bold.

681 ⁵Ino1 = Biotal Buchneri 500, and Ino2 = Biotal Supersile (Lallemand Animal Nutrition,
682 Milwaukee, WI); Ino3 = 11CFT (Pioneer, Johnston, IA).

683 ⁶Milk isolates possessing more than 80% similarity to forage isolates or commercial silage
684 inoculants as determined by the Pearson's Correlation Analysis applied to Random Amplified
685 Polymorphic DNA results.

686

687

688 **Captions for the figures**

689 **Figure 1.** Flow chart of farm sampling along with quantification, isolation and
690 characterization of lactic acid bacteria.

691 **Figure 2.** Box plot of lactic acid bacteria viable counts on ABEV agar in hay (H), grass or
692 legume silage (GL), and corn silage (C) either non-inoculated or inoculated (I) for the three
693 sampling periods (1: Spring 2015, 2: Fall 2015, 3: Spring 2016). See Materials and
694 Methods for composition of ABEV agar. Means with distinct capital letters were
695 significantly different ($P < 0.05$). The lines represent the median and the ends of the box
696 represent the 1st and 3rd quartiles. The whiskers represent 1st quartile $- 1.5 \times$ (interquartile
697 range) and 3rd quartile $+ 1.5 \times$ (interquartile range), and the dots represent the outliers.

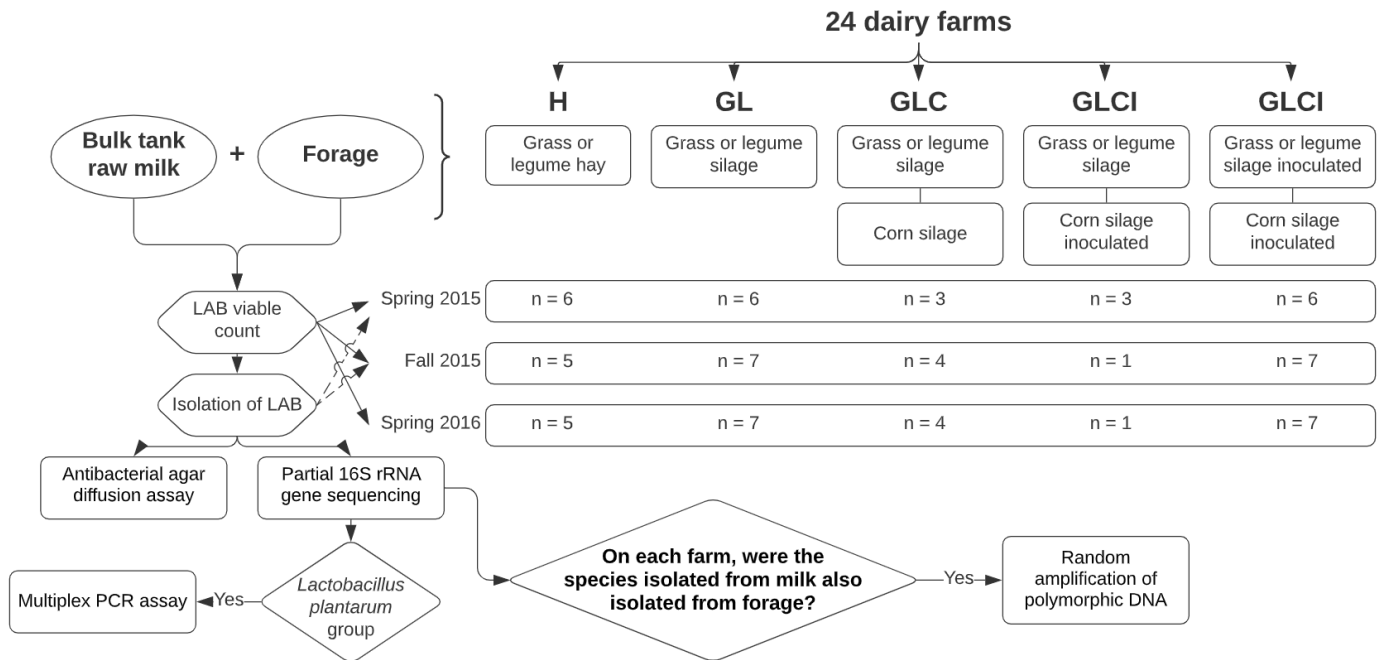
698 **Figure 3.** Relative abundance of lactic acid bacteria isolated from A) forages and B) bulk
699 tank milk for the first (Spring 2015), and second (Fall 2015) sampling periods. H: hay; GL:
700 grass or legume silage; C: corn silage; I: inoculated silage.

701 **Figure 4.** Comparison of lactic acid bacteria in the different forages: corn silage (white),
702 grass or legume silage (grey) and hay (black). The extended error bar plot presented the
703 lactic acid bacteria significantly different between forages at A) the genus level, and B) the
704 species level. Statistical analysis was performed using STAMP software. Multiple test
705 correction was Storey's FDR.

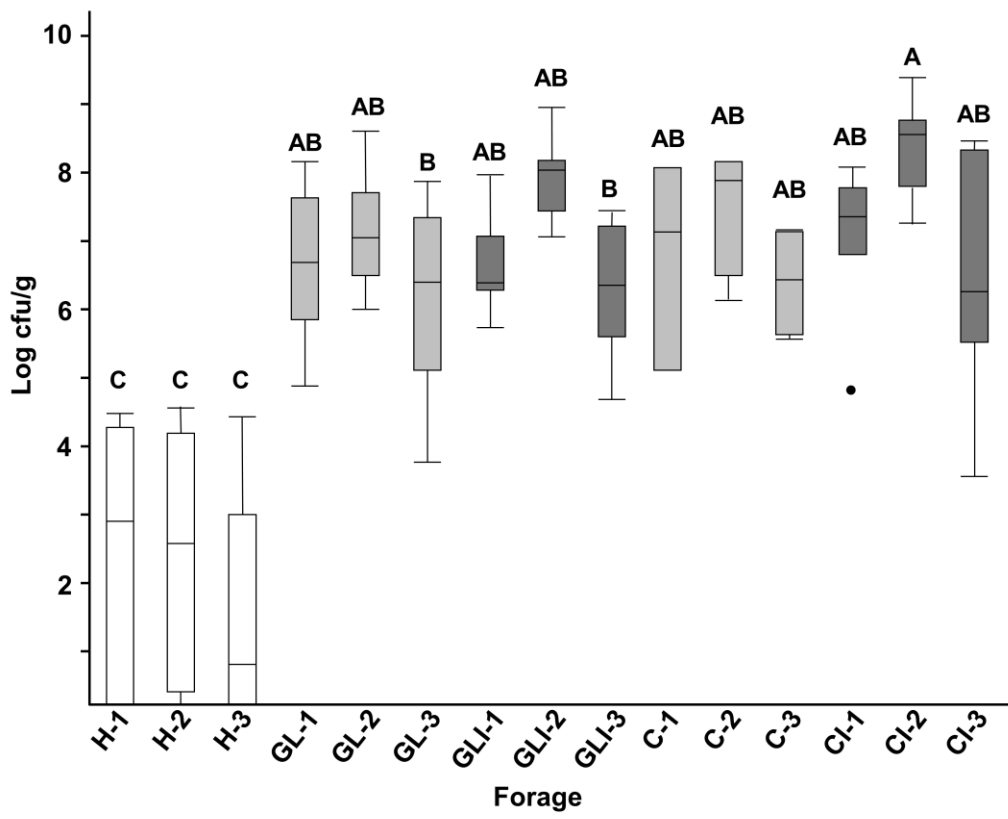
706 **Figure 5.** Effect of inoculation in grass or legume silage (GL). The extended error bar plot
707 presented the lactic acid bacteria significantly different between inoculated (I) and non-
708 inoculated silage at the genus level for first (S1; Spring 2015) and second (S2; Spring 2015)

709 sampling periods. Statistical analysis was performed using STAMP software. Multiple test
710 correction was Storey's FDR.

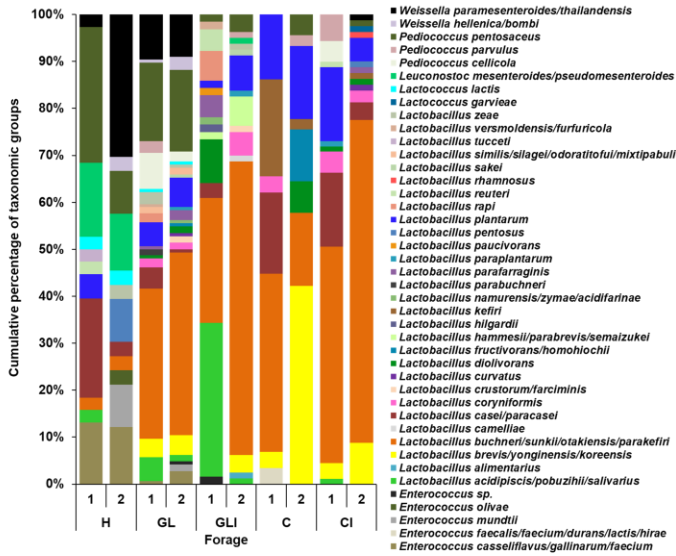
711 **Figure 6.** Box plot of lactic acid bacteria viable counts in bulk tank milk on ABEV agar
712 according to feeding types in hay (H), grass or legume silage (GL), and corn silage (C)
713 either non-inoculated or inoculated (I). See Materials and Methods for composition of
714 ABEV agar. Means with distinct capital letters were significantly different ($P < 0.05$).



JDS.2019-17918.R1 Figure 1



JDS.2019-17918.R1 Figure 2

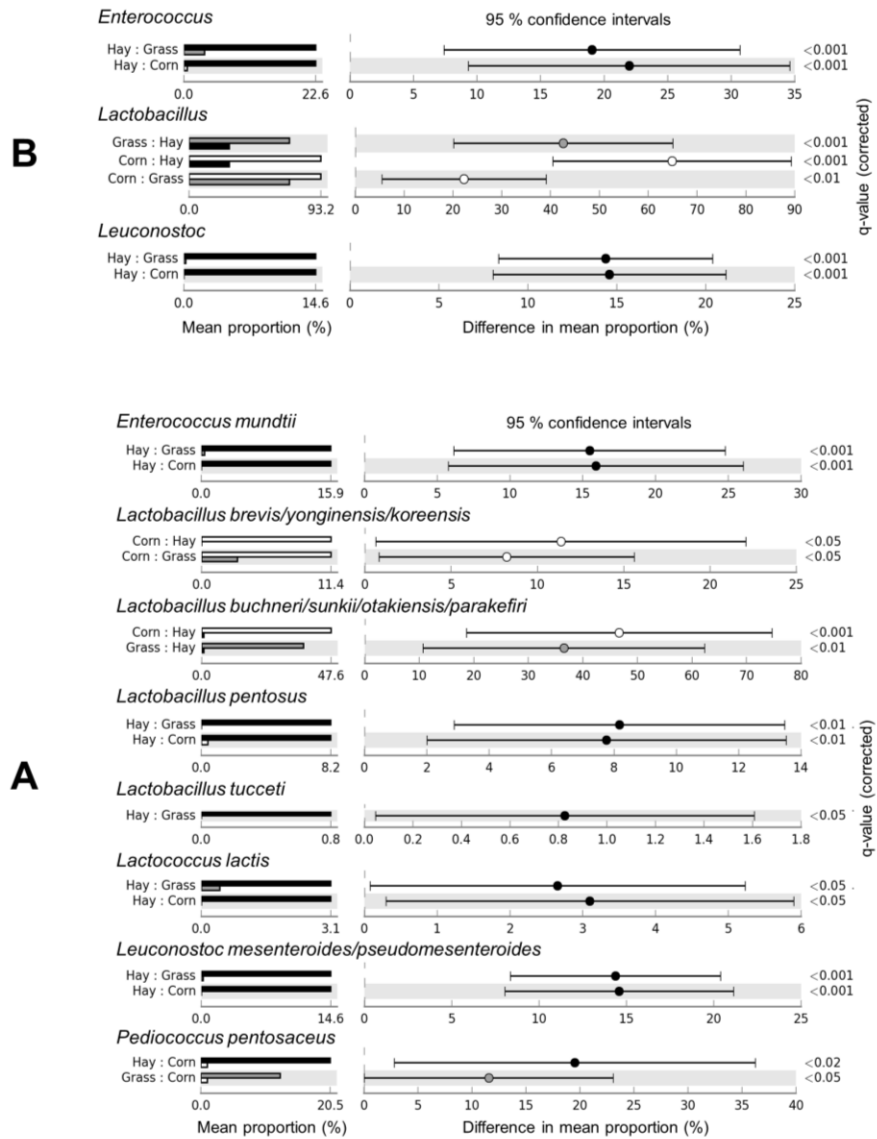


A)

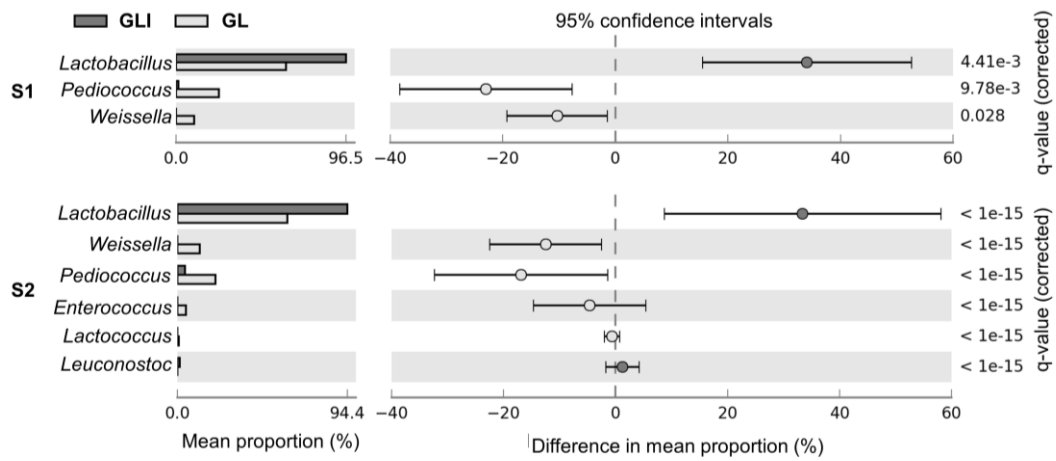


B)

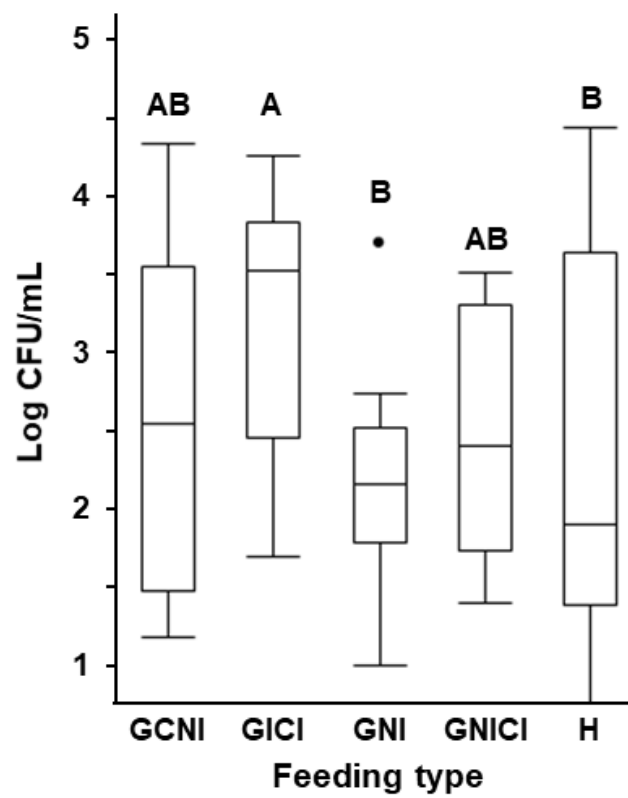
JDS.2019-17918.R1 Figure 3



JDS.2019-17918.R1 Figure 4



JDS.2019-17918.R1 Figure 5



JDS.2019-17918.R1 Figure 6