# Plant-based meat alternatives and their associated microbial communities

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## 4 Abstract

This is the abstract. It consists of two paragraphs.

5 Keywords: keyword1, keyword2

#### 6 1. Introduction:

For most of the population of the Western world, meat consumption is an integral part of their diet. An average U.S. American consumed 100kg and a European Union citizen 69kg of meat in 2021. The global meat consumption increased from 21kg per year and capita in 1990 to 34kg in 2021 (OECD data). Although the OECD estimates that consumption will level off at around 35kg per year and capita by 2030, the total 10 meat consumption will further increase with population growth. This globally growing appetite for meat is linked to livestock farming and consequently plays a major role in the ecological issues we are currently facing. Land degradation, climate change, water pollution and biodiversity loss are just some of the notable consequences for the environment (Steinfeld, 2006; Bianchi et al., 2018). Additionally, common industrial animal husbandry influences public health by supporting the spread of antibiotic resistances and vector-15 borne disease (Economou and Gousia, 2015; Bianchi et al., 2018; Watts et al., 2018). Apart from this, high 16 meat consumption, as practiced in the Western world and increasingly in transition countries, contributes 17 significantly to many widespread common diseases, which, in addition to individual illnesses, also burden 18 health care systems (Micha et al., 2010; Chan et al., 2011; Parkin et al., 2011; Feskens et al., 2013). Animal 19 welfare, environmental issues and increased health awareness are main drivers for more and more people in western civilization to change their meat consumption routines (Stoll-Kleemann and Schmidt (2017); Ploll and Stern (2020)]. In a survey, conducted 2021 in ten different European countries, 2% of the participants referred to themselves as vegan, 5% as vegetarians, 3% as pescetarians and 30% as flexitarians (European

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Union's Horizon 2020 reasearch and innovation programme, b). The last group is characterized, among other things, by the fact that they want to reduce their meat consumption, but do not want to give up the positive experience that comes with it. As main target group, flexitarians account for 90-95% of the sales of vegan and vegetarian products. A market research within "The Smart Protein Project" noted a sales value increase of 82% for plant-based meat (vegan and vegetarian) within 2018 and 2020 for Austria (European Union's Horizon 2020 reasearch and innovation programme, a). The sales of this product group and the number of different products have increased strongly over the last few years (Curtain and Grafenauer, 2019; European Union's Horizon 2020 reasearch and innovation programme, a). Despite the increased consumption of these 31 products, there have been only a few studies on their microbiological properties. However, these would be 32 important for ensuring food safety, characterizing potential hazards, assessing risks, and for sustainability 33 questions. Since two of the UN's sustainability goals (goal 2 – zero hunger and 12 – responsible consumptions and production) affects our eating habits, increased attention should be paid to reducing food waste. As 30% of food products in primary processing does not even reach the consumer, mainly because of microbial spoilage or pathogen contamination, it is essential to improve the knowledge of the microbial communities of our food, which could help to increase the shelf life and reduce the contamination with pathogens. Still largely unanswered is the question if and how a high microbial diversity on food (consisting of living and dead microbiota) can have a positive effect on consumer's health. For example, a high microbial diversity permanently stimulates the innate and adaptive immune system and provides resistance against colonizing 41 pathogens (Crowe et al., 1973, Mackowiak (1982), Smith et al. (2007)). It was also supposed recently, 42 that the loss of microbial diversity including the disappearance of ancestral indigenous microbiota, which is 43 currently happening in western countries, affects human health and contributes to post-modern conditions such as obesity and asthma (Blaser and Falkow, 2009; Vangay et al., 2018). For all these research questions fundamental knowledge on the microbial compositions on food are necessary, but still lacking. Since, little is known on these products, we sampled a selection of plant-based meat alternatives available in Austria's supermarkets to investigate the general microbial community patterns. Further we described characteristic microbial profiles and compared four groups of the most common product types (pea and soybean based products with either "minced" (minced meat, burgers, etc.) or "fibrous" (meat chunks, Schnitzel, etc.) texture. We hypothesized that products within one group have, based on similar protein processing, more 51 similar communities than between the groups. Since we examined a relatively undescribed product group, 52 we have chosen a combined approach using culture-dependent and culture-independent techniques. This 53 allowed a more complete description of the microbial community than any of the applications could stand on their own, but also raised additional questions and uncertainties that are relevant to future microbial research of (highly processed) foods.

## <sup>7</sup> 2. Material and Methods

## 2.1. Sample acquisition

We purchased 32 different plant-based meat alternative products, between July 12 and July 14, 2021, from four supermarket groups. Pea- and soybean- protein based products with either a minced or a fibrous structure were the most common representatives of this product group at this time point in Austria. Additional criteria for the selection were, that the products where entirely plant-based (vegan) and do not contain fermented products, like tofu. Beside these characteristics, the samples were different in their composition, packing, shelf-life etc. (Table 1). All samples, including two frozen products, were transported refrigerated and stored at 4°C until processing. Sample processing took place within the minimum shelf life range and latest five days after purchase.

## 67 2.2. Sample preparation

In total, 10 g of each sample, representing all layers of a product, were placed in sterile Stomacher bags and diluted with 90 ml sterile PBS. A Stomacher ... was used to mechanically comminute the samples for 120 s. To remove coarse food particles, 45 ml of the homogenate was centrifuged at 300 relative centrifugal force(rcf) for 2 min at room temperature using an Eppendorf Centrifuge 5810R and an A-4-62 rotor. The remaining supernatants were transferred to new tubes and centrifuged at 3,000 rcf (30 min at RT). The obtained cell pellets were diluted 10-times with sterile phosphate buffered saline (PBS).

#### 74 2.3. Bacterial and fungal isolation

We carried out two sets of cultivation experiments. The first set was more general with a basic set of non-selective and selective media (Columbia agar, Violet Red Bile Dextrose agar (VRDB), brain heart infusion agar (BHI), plate count agar (PCA), Rose Bengal (RB), and Baird Parker (BP) agar), to get a broad range of the expected microbial community. The plates were inoculated with a 102 dilution and aerobically and semi-anaerobically incubated at 37°C. In order to recover high amounts of different isolates, the plates where incubated for 16-68 hours, depending on colony size and growth density. Samples with too high growth densities after 16 h for picking single colonies were diluted 103 or 104 in sterile PBS and plated again. For the second media set we used the information from the 16s rRNA ampicon sequencing

to select specific media and growth conditions in order to isolate representatives of genera we could not isolate under the first set's conditions. Depending on the sample specific microbial composition we used Luria Bertani-, nutrient-, tryptic soy-, marine-, corynebacteria-, De-Man-Rogosa-Sharpe- and pseudomonas agar and cultivated the samples (dilution 102-105) anaerobically at 25°C for 48h. In both sets we selected morphologically unique, single colonies for re-cultivation and Sanger sequencing. DNA was extracted, using protocol modified after Walsh et al. (Walsh et al., 2013), by lysing pure cultures with  $100\mu$ l 0.01M Tris-HCl and 400µl 2.5% Chelex 100 resin solution (BioRad) at 95°C for 10min, followed by centrifugation with 15,000 rcf for 30 sec. The supernatants were subsequently used for 16S rRNA gene PCR, using a final concentration of 200nM of each of the universal Primers from LGC (27F - 5'-GAG TTT GAT CMT GGC TCA G-3' and 1492R - 5'-GGY TAC CTT GTT ACG ACT T-3'), 0.025 U/µl Invitrogen<sup>TM</sup> Platinum<sup>TM</sup> 92 Taq DNA-Polymerase, 1x TaqMan PCR buffer, 2mM MgCl2, and 250nM dNTP Mix (Thermo Scientific<sup>TM</sup>). 93 For the reaction a protocol of 95°C for 5 min (Tag activation) followed by 35 cycles of 40 seconds at 95°C (denaturation) 40 seconds at 52°C (annealing) and 1 minute at 72°C (elongation) was used. For negative control a reaction with ddH20 as well as a reaction the negative extraction control were performed. Inhouse Listeria monocytogenes DNA served as positive control. All PCR products were checked with a QIAxcel DNA High Resolution Kit in a QIAxcel Advanced system. Negative PCR results were followed by an ITS2 gene PCR (200nM of each of the primers ITS3-5'-GCATCGATGAAGAACGCAGC-3' and 99 ITS4-5'-TCCTCCGCTTATTGATATGC-3' (White et al. 1990),  $0.025~\mathrm{U}/\mu\mathrm{l}~\mathrm{Invitrogen^{TM}}~\mathrm{Platinum^{TM}}~\mathrm{Tag}$ 100 DNA-Polymerase, 1x TaqMan PCR buffer, 2mM MgCl2, and 250nM dNTP Mix (Thermo Scientific<sup>TM</sup>), 101 with a protocol of 95°C for 5 min (Taq activation) followed by 30 cycles of 40 seconds at 94°C, 40 seconds at 102 56°C and 1 minute at 72°C). For cultures, negative in 16S rRNA and ITS2 PCR, we repeated the extraction 103 with the NucleoSpin tissue kit (Machery-Nagel), using the manual in combination with the recommendations 104 for hard to lyse bacteria. LGC Genomics GmBH (Berlin) purified and sequenced the PCR products in one 105 direction (using 27F primer for 16S rRNA and ITS4 for the ITS2 region). For quality trimming we used 106 "method 2" (with a defined sliding window of 15 bp and an Phred score mean quality of 40) within the "SangerRead" function ("sangeranalyseR" package; R [? Core Team 2021)). Trimmed sequences, with >100 108 bp length, were classified with the "assignTaxonomy" function of the "dada2" package in R (with kmer size 109 8 and 50 bootstrap replicates), based on a RDP Naïve Bayesian Classifier algorithm (Wang et al. 2007). 110 Potential pathogens and unclassified Enterobactericeae were further whole genome sequenced on a MinIon 111 MK... 112

## 3 2.4. Bacterial quantification and composition

For direct DNA extraction the DNeasy PowerFood kit was used. That for, the in RNAlater stored cell 114 pellets were thawed, centrifuged  $(3,000\times g, 30min)$  and resuspended in ???  $\mu l$  MBL buffer. Deviating from 115 the DNeasy PowerFood protocol, the lysis step was proceeded in ... tubes. The further steps were processed 116 according to the protocol. The elution step was done twice with  $30\mu$ l sterile water, respectively. Parallel 117 an extraction of pure water was performed as negative extraction control (NEC) Sequencing libraries of 118 the 16S rNRA gene (V3/4 region) were prepared based on Illumina 16S Metagenomic Sequencing Library 119 Preparation recommendations. Primers 341F (5 -CCTACGGGNGGCWGCAG-3) and 805R (5 -GAC TAC 120 HVG GGT ATC TAA TCC-3 (Klindworth et al. 2013) were used together with Illumina adapter sequences 121 (5 CGT CGG CAG CGT CAG ATG TGT ATA AGA GAC AG-3 and 5 GTC TCG TGG GCT CGG AGA 122 TGT GTA TAA GAG ACA G-3, respectively) for amplification. Libraries were constructed by ligating 123 sequencing adapters and indices onto purified PCR products using the Nextera XT Sample Preparation Kit 124 (Illumina). Equimolar amounts of each of the purified amplicons were pooled and sequenced on an Illumina 125 MiSeq Sequencer with a 300-bp paired-end read protocol. 16S rRNA gene amplicon library generation and sequencing was performed at the Vienna Biocenter Core Facilities NGS Unit (www.vbcf.ac.at).

## 2.5. Sequence Processing and Statistics

The data obtained from the MiSeq sequencing went through a Qiime2 workflow including demultiplex-129 ing and DADA2 denoising and QC filtering. The taxonomic classification was done with the Scikit-learn 130 algorithm using a pre-trained full-length-uniform-classifier based on the SILVA 138.1 database. After re-131 moval of sequences with mitochondrial or chloroplastic origin, further analyses were performed with R. To estimate the alpha-diversities of the samples Hill-Simpson and Hill-Shannon diversity were calculated using 133 the "iNEXT" package, based on 99.5% coverage rarefied samples (Roswell et al. 2021). Group comparisons were done with Kruskal-Wallis tests followed by Bonferroni-alpha-corrected Dunn's tests for pairwise 135 comparisons. For beta diversity analyses the samples were rarefied with 100 iterations based on a coverage 136 of 99.5% using the package "phyloseq" and "metagMisc" [? und Jost 2012). Based on that we generated 137 distance matrices with Bray-Curtis dissimilarities, Jaccard indices and Jensen-Shannon divergence and use 138 them for graphical (t-distributed stochastic neighbor embedding - tSNE) and statistical (PERMANOVA, 139 LEfse) analysis. For tSNE we used the "Rtsne" package with a maximum of 1000 iterations, a perplexity of 5 140 and two initial dimensions, as recommended by Oskolkov [? 2019). The high variability of the products and little knowledge on the underlying production conditions made it impossible to find adequate variables for

PERMANOVA, but the main protein source and the texture. The producing facility as additional variable would be meaningful, but the product assortment is dominated by one company, which made the model design very unbalanced. PERMANOVA was done with the "vegan" package using "betadisp" to check for 145 homogeneous dispersion and "adonis" functions for PERMANOVA with 999 iterations using main protein source and texture as explanation variables. Lefse was done with the relative abundance data of the coverage rarefied data in combination with "phyloseqCompanion" R package, for data transformation and the 148 Lefse Bioconda tool by ..., using the protein source and texture as class, a normalization of 1 million and a log<sub>10</sub> LDA score threshold of 4.0. In parallel, a group comparison for the same features, as examined with 150 Lefse, was done with Kruskal-Wallis tests followed by a Benjamin-Hochberg alpha correction. The Sanger 151 sequences from the Isolates were trimmed using the "sangeranalyseR" package with a Quality Score Cutoff 152 of 40 and a sliding window size of 15. Sequences with a minimum length of 100bp and a trimmed mean 153 quality score >35 were used for taxonomic classification based on the SILVA 138.1 database. Further, the 154 isolate sequences were assigned to a database generated from the MiSeq data to connect the culture-based 155 and culture-independent approaches. For figure 1, the isolate sequences of each genus were clustered within 156 each sample, group and producer using the IdClusters function from the "DECIPHER" package with a cutoff of 0.06. More clusters within each genus were interpreted as a higher species or strain diversity within each 158 genus. Selected isolates were whole genome sequenced with the MinIon, using... The obtained data were 159 trimmed and filtered with filtlong, assembled with Flye followed by several polishing steps (four repetitions 160 of racon and a final step with medaka), before they were used in the TORMES workflow. 161

## 3. Results

### 3.1. Product descriptions

The four groups did not have the same sizes, since the product portfolio for each group was not large enough. Still, we had an overall of 16 pea-based and 16 soybean-based products (Table 1). Beside the four main properties, the products were quite diverse. Particularly noteworthy is the number of ingredients used per product (4-27, with a total of about 120 different used ingredients within the 32 sampled products) and the large range of shelf life. The products are also different on factors, which might influence the bacterial composition, i.e. pre-heating or freezing steps, as well as packing in modified atmosphere. Most of the products had clear cooking instructions on the labels, including the recommendation for thorough cooking (Table 1). In total, 27 samples were packed in modified atmosphere with unknown composition. Out of 30

samples sold refrigerated (the other two frozen) six products were frozen at any point during the retail chain (Table 1).

## 3.2. Cultivable microbial communities

In total, 465 colonies were picked and selected for 16S rRNA or ITS gene sequencing. Among these, 175 431 could be classified to the genus level, representing 38 genera in four different phyla (Figure 1). The 176 remaining isolates could only be assigned to family level (n=16, all Enterobactericeae), were fungi (n=15; 177 Wickerhamomyces (n=7), Issatchenkia (n=6), Yarrowia (n=1), Dipodascus (n=1)), or stayed unassigned 178 (n=3). We isolated Bacillus from 19, Leuconostoc from 18, Enterococcus from 12, Latilactobacillus from 179 10 samples. Species from the genus Bacillus, Leuconostoc and Latilacto Bacillus could be isolated from 180 each of the four sample groups. Enterobacteriaceae, which are usually surveyed as an additional hygiene 181 criterion, were only found in the pea protein products of a single manufacturer (Figure 1). A selection of these Enterobacteriaceae and isolates classified as potential pathogens (i.e. Staphylococcus aureus, Bacillus cereus group, Klebsiella sp.) were whole genome sequenced with a MinION device. DATA MISSING

## 185 3.3. Lactic acid bacteria and gamma-Proteobacteria dominate the 16S rRNA amplicon sequences

In total, 28 samples (883,866 sequences; median frequency per sample: 25,627; range: 439-253,681) 186 passed the quality criteria and were processed with QIIME 2. Because we used coverage based rarefaction 187 (with a coverage of 99.5) and all of the remaining samples meat this coverage, we removed none of them for 188 further analysis. Over all samples, the ASVs were assigned to 25 different Phyla, however, only three Phyla with >3% in at least one of the samples were found (i.e. Firmicutes 0.00-0.95%, Proteobacteria 0.00-0.31%, Bacteroidota 0.00-0.11%). In total, 18 samples were dominated (>50% relative abundance) by Firmicutes (10 191 samples with >90%), while in the other 10 samples Proteobacteria is the most abundant Phylum. The most 192 common genera were Leuconostoc (detected in 26 samples; 0.03-100.00% rel. abundance), Latilactobacillus 193 (detected in 21 samples; 0.02-86.38% rel. abundance), Pseudomonas (detected in 21 samples; 0.36-35.25% 194 rel. abundance), Serratia (detected in 19 samples; 0.03-8.92% rel. abundance), and Acinetobacter (detected 195 in 18 samples; 0.09-15.40% rel. abundance). The genus Leuconostoc was the most abundant in 13 samples, 196 followed by Latilactobacillus (4 products), and Shewanella (4 products) (Figure 2). Some genera were found 197 proportionally high (10%) in one or more samples, but could not be isolated (i.e. Shewanella, Xanthomonas, Photobacterium, Myroides, Pediococcus). 199

## 3.4. Protein source and texture are not the main driver for the community pattern

The Kruskal-Wallis tests comparing the alpha-diversity indices (i.e. Hill-Shannon index and Hill-Simpson 201 index) between the four groups (based on proteins source and texture) were significant (p.value = 0.018 and 202 0.049), but in post-hoc Dunn's test with Bonferroni alpha adjustment only the Hill-Shannon index between 203 groups "pea-fibrous" and "pea-minced" differed significantly (p.value= 0.015 - Supplement Figure xy). The 204 group dispersions were homogenous in all examined distance methods (i.e. Bray-Curtis, Jaccard, JSD). 205 The PERMANOVA showed that texture and protein source significantly affects the microbial composition 206 (Supplement Table 2), but explained only between 15.4629221 and 22.7898534% of the total variance. The 207 variance explanation by the PERMANOVA would increase, if the manufacturer as variable was added to 208 the model, but since the sampling was very unbalanced on that, we avoided this step. 209

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## 211 3.5. 16S rRNA sequencing revealed three distinct community profiles

In the tSNE plot we see three distinct clusters (Figure 3), which we described, based on the dominating genera as *Leuconostocaceae*-, *Latilactobacillus*- and *Proteobacteria*-profiles. The clustering is traceable, when comparing the similarity of the relative abundance patterns of the samples within each cluster. underlined the heterogenic microbial pattern of Figure 2. Although there is some clustering, there is no clear separation based on the examined variables (main protein source, status, manufacturer).

ALPHA DIV AND LEFSE FOR PROFILES LEfSe identified 32 discriminative features with an LDA
Effect Size >4.0 (Fig 3). This analysis highlighted a predominance of Leuconostocaceae (log LDA 5.48) and
its classification levels above in pre-cooked pea products. It identified *Proteobacteria* (log LDA 5.33) as most
characteristic for raw pea products, mainly based on the predominance of Pseudomonas (log LDA 4.81).
Highly discriminant for soy products were some low abundant features. LEfSe calculated and log LDA score
of 4.68 for Acetobacter in pre-cooked soy products and of 4.62 for Flavobacteriaceae in raw soy products.

### 223 4. Discussion

Highly processed food, like the plant-based meat alternatives we examined in this study, brings challenges to microbiologists. The broad range of ingredients (~120 in in the 32 examined products), different
processing steps, and a variety of equipment lead to many potential sources for bacterial contamination.
The product specific production processes were not available, but up to the present low and high moisture
extrusion are most common commercially used technologies to produce meat textured plant proteins. Both

methods are based on an interaction of heat, shear forces and pressure. The conditions for this process depends on the original protein source and the desired protein structure. During the extrusion, the protein 230 dough undergoes temperature gradients between starting at room temperature and ending between 130 and 231 160°C at a pressure of.... Blabla et al., described, that the dough remains about two minutes at the final high temperatures. Currently, we assume, that only spore forming bacteria like Bacillus would survive the extrusion process. That is also described by Domig et al., who could only isolate Bacillus spp. from extruded 234 proteins...(i.e. Bacillus and Clostridium) can survive (Leutgeb, 2017). This could be one explanation why was isolated from most of the samples (19/32), while the relative abundance of 16S rRNA gene DNA is 236 relatively low, compared to other genera. Overall, we assume, due to this initial extrusion procedure, the 237 main protein is not the source for most of the living bacterial cells we have isolated from the products. The 238 extrusion process (and other heating and freezing steps during the production) brought challenges for the 239 interpretation of sequencing data. It is in the principle of the method that it cannot differentiate between 240 living and dead, which raises the question of whether the use of 16S rRNA metagenomics is an appropriate 241 means of investigating highly processed foods. Along with these processes, there are many changes in the 242 environmental conditions for the products and their associated microbial communities, like heating, thawing, freezing and cooling steps, but also packing in modified atmosphere. These conditional changes could kill or inactivate bacterial cells, while their DNA remains largely intact, but could also induce viable but noncul-245 turable states (Li et al., 2014; Zhao et al., 2017). We agree, that it should not be used as standalone method, but it i) supports culture-based methods and allows to adapt media and culture conditions to genera we 247 find in the sequencing data, which is especially important for less examined environments (i.e. new foods), 248 ii) is able to detect viable but non culturable bacteria, and iii) uncovers contaminations during the process, 249 which could help to adapt HACCP concepts. In this study we examined nine samples with high relative 250 abundancies of Proteobacteria, mainly Pseudomonas, Psychrobacter and Shewanella. These three genera, 251 are common spoilers in meat and fish products (Odeyemi et al., 2018)., especially in products with slightly 252 higher pH values, like fish, sea food and poultry. Plant-based meat products are usually also slightly higher in pH (Quellen). Although the number of ASVs within a these genera is much higher, compared e.g. with Leuconostoc from other samples, what we associate with different sources of contamination, there are still 255 single ASVs with relatively high abundancies, which indicates either a large entry from one source or an 256 active growth on the product at some time point during the production. The most obvious sources would 257 be the main protein, the used water (via biofilms in water reservoirs or water hoses) or biofilms during the 258 process. From the found genera in the MiSeq data, at least 13 are described as biofilm builders in food

processing environments (Wagner et al.), among these Pseudomonas, Psychrobacter and Shewanella. The 260 possibility of biofilm formation on the processing equipment is high, since many of the used machines are 261 hard to clean. However, this is contradicted by the fact that among the nine Proteobacteria-dominated 262 samples seven had a very similar pattern, but were from six different producers. There are no available 263 studies on the microbial communities of raw soybean or pea proteins, but 16S rRNA patterns of peas or the phyllosphere of soy do not support the thesis, that this kind of contamination is associated with the main 265 protein source. Only sample B4, which is the only sample, that is dominated by Alphaproteobacteria, had high similarities to the microbial community of the soy phyllosphere (Vorholt, 2012). However, some of the 267 producer just have a few products in this food segment, so we would not exclude, that they buy already 268 extruded proteins from a large distributor and use it for their products. 269 The comparison of the diversity of the different groups is limited. Since the study design was focused on de-270 scribing the microbiota of different meat alternatives and to detect possible differences between main protein 271 sources and texture, it was not quite balanced in other perspective. The two most frequently represented 272 manufacturers contributed 18 (11+7) out of 32 products in this study, while the other seven manufacturers 273 contributed with a maximum of two samples. As shown in Supplements Table 1 manufacturers have usually specialized their products to one of the four examined groups. We assume that the production plant has 275 non-negligible effect on the product's microbiota, which could be seen in part in Figure 3. Based on 276 the microbial distribution patterns from the MiSeq data, we roughly describe three different community 277 compositions. The Leuconostocaceae dominated samples (14/27), the Latilactobacillus dominated samples 278 (4/27) and the *Proteobacteria* dominated samples. In the first two groups each sample is clearly dominated 279 by one ASV respectively. That speaks for the fact, that there was an active and growing population at any 280 timepoint on the product. Beside of three samples, the dominating ASV assignable to an isolate, there-281 for we assume, that these species are actually active in the final product. This is especially true for the 282 Lactic acid bacteria. The role of the isolated and sequenced LABs (especially Leuconostoc mesenteroides 283 and Latilactobacillus sakei) on this product group has to be assessed from several perspectives. They are fermenters on many food products and contribute there to the formation of substances relevant to taste. 285 They inhibit with their metabolites (i.e. organic acids) and their secondary metabolites (i.e. Bacteriocin) 286 the growth of pathogens and spoilage bacteria, but they are spoilage bacteria themselves, especially on meat 287 and meat products. Most of the isolated LABs have ambiguous positions in foods and food production. 288 While Latilactobacillus and Leuconostoc were used for fermentation of tofu, tempeh or Kimchi, they were 289 also commonly described as food spoilers in non-fermented products, like fresh meat (Casaburi et al., 2015).

Since the examined products were neither assignable as fermented food, nor had fermented products as in-291 gredients (besides vinegar), we associated the isolated genera primarily in their position as product spoilers 292 and not as part of a planned fermentation process. In 18 out of 27 samples with utilizable MiSeq data were 293 lactic acid bacteria dominating (Leuconostoc 13, Lacto Bacillus 4, Weissella 1), which is expectable as LABs are described as dominating species on fruits and vegetables [? et al. 2020). While ten of the Leuconostoc dominated products were pea protein based, all four Latilactobacillus-dominated samples were soy products. 296 The microbial community of all of the pea products with fibrous structure had >95\% abundances of LABs (Leuconostoc, Latilactobacillus, Weissella, Carnobacterium). Leuconostoc is described to have a starting 298 advantage over other LABs on plant products, based on its ability to ... According to that Leuconostoc is 299 often described as dominating LAB at the beginning of a fermentation process. 300 Diverse Latilactobacillus sakei strains wurden erfolgreich auf verschiedensten Produkten als Biokonservativ 301 getestet und ist im Regelfall im Vorteil gegenueber Leuconostoc. Zum einen spielen beide Spezies eine Rolle 302 in der Fermentation von diversen pflanzlichen Produkten. In Kimchi ist Leuconostoc in den ersten Tagen, 303 der dominierende LAB und wird zunehmend von Latilactobacillus sakei verdraengt [? et al. 2013) Gaaerts 304 et al., 2020 examined ready to vegetarian, vegan and insect based meat alternative, including products with fermented ingredients, like fermented sour dough. Based on that, they assumed sour dough as main source 306 for Latilactobacillus sakei, which they isolated most. Different to that study, we excluded products with 307 fermented ingredients, but vinegar. Still we found large amounts of lactic acid bacteria in the examined 308 products. Unlike Graeerts et al., we isolated Leuconostoc mesenteroides from the majority of the samples. 309 This species is an obligate heterofermentative LAB, using the phosphoketolase pathway for glycolysis, with 310 lactic acid, acetic acid, CO2 and ethanol as metabolites [? 2015). ... While Bacillus spp. were frequently 311 described as spoilers in bakery and dairy products, but also in meat and poultry, Leuconostoc spp. were 312 mainly associated with the spoilage of meat and seafood but also of vegetables (minimally processed and 313 ready to eat products (Lianou et al., 2016). Lacto Bacillus (meat, seafood) pseudomonas (meat, seafood, 314 milk). Undoubtedly, some manufacturers are guided by those similarities when determining their products shelf life and consumption recommendations. Two manufacturer labelled all their products with expiry 316 dates, the others with best before dates. We think that because of the novelty of these products and accom-317 panying missing experience, consumers might not be able to recognize spoiled products by odor or taste. 318 However, broader investigations tailored to this product category and considering the manifold microbial 319 sources, could increase product stability, facilitate manufacturer's decision for product labelling, and help 320 consumer to recognize spoiled products. Altogether, could reduce food waste and increase sustainability of 321

these products. Beside the dominating, spoilage associated genera, we also isolated some Enterobactericeae 322 (i.e. Raoultella, Kosakonia, Klebsiella, Escherichia/Shigella, Enterobacter, Citrobacter, Atlantibacter). All 323 of these isolates came from products of the same manufacturer. In MiSeq the relative abundances of Enter-324 obacteriaceae were very low in all examined samples. All products were labelled with cooking instructions, 325 most of them specific with cooking time in minutes, others only with "heat through before consumption". This final heating step by the consumer can be a part of the HACCP concept of the manufacturer. While 327 cooking time in minutes is a good guidance for the consumers, "heat through" alone is in our opinion too less information. First there is a lack of experience with these kind of products, second in contrast to real 329 meat (products) there is no indicator like color change for most of these products to determine a sufficiently 330 cooked state. Enterobacteriaceae widely serve as hygiene indicators. According to the sequence data En-331 terobacteriaceae had a minor role in the examined samples. However, we isolated seven different genera of 332 Enterobactericeae, among these Enterobacter, Salmonella, Klebsiella and Citrobacter. This indicates, that 333 the conditions in this product group are given for the survival of Enterobacteriaceae, including potential hu-334 man pathogenic species like Enterobacter aerogenes, Salmonella enterica, Klebsiella oxytoca and Citrobacter 335 freundii. Knowing this, we would recommend process hygiene criteria for this product group and offering preparation instruction (incl. cooking time) for all of the products. 337 General statements about the microbiological risk of these products are difficult to make, since produc-338 ers, consumers, regulatory authorities, and scientist are not quite experienced with these kind of products. 339 (gueltige regulierungen, haccp concept) In terms of product safety, four critical issues are in the hands of con-340 sumers: spoilage detection, handling of the products and used utensils before cooking, the cooking/heating 341 step and the storage for later consumption. Spoilage detection: 2 producer with expiration dates (orien-342 tierung an faschierten) rest laesst es den Konsumenten. Keine Erfahrungswerte unmoeglich am geruch zu 343 erkennen, jedes produkt andere rezeptur. Mhd produkte tendetiell hoehere BCE. Große schwankungen in den shelf lifes. Handling of the products: kaum Erfahrung. Wird es wie Fleisch behandelt oder eher nachlaessig. Allgemeine Kuechenhygiene, eigene utensilien bzw. wschschritte handhygiene etc. wir sehen das pathogen in den rohen produkten wachsen koennen. Selbst wenn fleisch erhitzt wird bei fehlender kuechenhygiene hab 347 ich das dann halt wo anders Cooking/heating step. Most oft he products have cooking instructions. Studie hat gezeigt dass die standard pathogene absterben wenn man die produkte wie fleisch entsprechend erhitzt. 349 Fehlende instructions nicht befriedigend. Nur durcherhitzt verzehren als instruction zu wenig, da aquders 350 als bei Fleisch eine durcherhiztung optisch nicht erkannt werden kann Storage for later consumption: studie 351 der ungarn. Halten tendentiell kuerzer als die fleisch pendants im kuehlschrank nach der zubereitung. 352

#### 53 5. Conclusion

## 6. Conflict of Interest

The authors confirm that they have no conflicts of interest with respect to the work described in this manuscript.

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#### 360 8. Contributions of Authors

- 9. Tables
- 362 10. Figures

## 363 11. Supplements

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