1	Microbial community-based production of single cell protein from
2	soybean-processing wastewater of variable chemical composition
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18 Abstract

19 The use of food-processing wastewaters to produce microbial biomass-derived single cell 20 protein (SCP) is a sustainable way to meet the global food demand. Yet, despite the potential 21 benefits of lower costs and greater resource recovery compared to pure cultures, 22 bioconversion processes relying on microbial community-based approaches to SCP 23 production have received scarce attention. Here, we evaluated SCP production from soybean-24 processing wastewaters under controlled reactor conditions using the existent microbial 25 communities in these wastewaters. Six sequencing batch reactors of 4.5-L working volume 26 were operated at 30 \square for 34 d in cycles consisting of 3-h anaerobic and 9-h aerobic phases. 27 Four reactors received no microbial inoculum and the remaining two were amended with a 28 1.5 L of mixed culture from a prior microbial community-based SCP production. Microbial 29 characterization was done via 16S rRNA gene metabarcoding. Influent wastewater batches 30 had variable chemical characteristics but a similar microbial composition. Reactors produced 31 more SCP when fed with wastewaters of higher soluble total Kjeldahl nitrogen (sTKN) 32 content and a lower carbon-to-nitrogen ratio (sCOD:sTKN). The biomass protein yield 33 ranged from 0.24 to 3.13 g protein/g sTKN, with a maximum protein content of 50%. An 34 average of 92% of sCOD and 73% of sTN removal was achieved. Distinct microbial 35 communities were enriched in all six bioreactors after 34 d, where the prevailing genera 36 included Azospirillum, Rhodobacter, Lactococcus, Novosphingobium, and 37 Acidipropionibacterium. In contrast, the microbial community of influent wastewaters was 38 dominated by Lactococcus and Weissella. We showed that constituents in soybean 39 wastewater can be converted to SCP through microbial community-based growth processes 40 and demonstrated the effect of variable influent wastewater composition on SCP production.

41 Keywords: carbon-to-nitrogen ratio; essential amino acid; probiotic; single cell protein;
42 animal feed; circular economy

43 **1. Introduction**

Microbial protein or single cell protein (SCP) consists of dried microorganisms with a 44 45 high protein content along with fats, carbohydrates, vitamins, and minerals (Suman et al., 46 2015). It represents a promising alternative to fishmeal as a protein source in aquaculture, 47 especially when raising sea bass, Atlantic salmon, rainbow trout, and whiteleg shrimp (Jones 48 et al., 2020). Producing SCP from wastewaters would help alleviate the environmental impact 49 caused by both traditional agricultural food production (Owsianiak et al., 2022) and 50 wastewater treatment and disposal (Durkin et al., 2022; Spiller et al., 2020). SCP also has the 51 potential to outperform staple crops in terms of protein yield per land area (Leger et al., 52 2021). According to estimates, by 2050, the adoption of microbial protein could reduce the 53 required cropland area, global nitrogen losses from croplands, and agricultural greenhouse 54 gas emissions worldwide by 6%, 8%, and 7%, respectively (Pikaar et al., 2018).

Microbial biomass may be produced by growing pure cultures (axenic SCP) or a 55 56 mixture of strains or taxa (microbial community-based SCP), provided they can use 57 wastewater as a source of carbon, energy and reducing power. A microbial community-based 58 process has potential advantages over axenic culturing, such as a higher protein content due 59 to synergistic interactions between different SCP-producing groups and utilization of various carbon and nitrogen sources in the substrate (Alloul et al., 2021a), process stability in terms 60 61 of resistance and resilience to disturbances (Santillan et al., 2020b; Santillan et al., 2019a; 62 Santillan & Wuertz, 2022), and the accumulation of intracellular components (Janarthanan et 63 al., 2016). Further, this approach takes advantage of the microbial taxa already present in the 64 wastewater by providing suitable growth conditions (Vethathirri et al., 2021). Indeed, the 65 most suitable microbial organisms could be enriched within a mixed community to perform 66 the targeted biotechnological process (Verstraete et al., 2022). Mixed microbial communities 67 grown on wastewaters can meet the minimum dietary requirement of aquaculture animals

68 (Vethathirri et al., 2021). However, information on the existent microbial communities in 69 influent raw wastewaters and the enriched communities in such SCP production systems is 70 scarce. Three types of bacterial consortia are used in microbial community-based systems, 71 namely, aerobic heterotrophic bacteria, microalgae and aerobic heterotrophic bacteria, and purple phototrophic bacteria (Spiller et al., 2020; Vethathirri et al., 2021). Only the latter, 72 73 which use light as energy source for the assimilation of organics and nutrients, have been directly enriched from wastewaters for SCP production (Hülsen et al., 2022). To our 74 75 knowledge, the present study is the first to grow SCP based on aerobic heterotrophic bacteria 76 present in the wastewater.

77 Compared to other wastewaters, food-processing wastewaters are of interest for 78 microbial protein production due to their much lower content in pathogens, heavy metals, and 79 other toxic contaminants. Chemically characterizing such wastewaters helps to assess their 80 suitability for microbial biomass formation, with bioavailability of carbon- and nitrogen-81 containing organic compounds a key parameter (Vethathirri et al., 2021). In general, the 82 chemical characteristics of food-processing wastewaters, including their carbon-to-nitrogen 83 ratio (C:N), vary widely with production processes (Nayyar et al., 2021), making microbial 84 community-based SCP production a challenging task. For it to be cost-effective and 85 sustainable, the addition of external nutrients to maintain a suitable C:N should be avoided. 86 Consequently, it is necessary to investigate how varying C:N affects both microbial growth 87 and protein yield.

The overall aim of this study was to assess the production of microbial communitybased SCP over time using different batches of the same source of soybean-processing wastewater. The objectives were to (1) microbially characterize the wastewater and community-based biomass; (2) determine suitable chemical characteristics in the feed to achieve a higher biomass yield and protein content; (3) characterize the amino acid content in

93 the microbial protein produced; and (4) evaluate the effect of inoculation with a seed 94 consortium on SCP production rate and yield. We showed that through microbial community-95 based growth, soybean-processing wastewaters can be converted directly into microbially 96 derived protein that meets the amino acid requirements of aquaculture feed.

97 **2. Materials and methods**

98 2.1 Experimental design

99 Six 4.5-L bioreactors were operated as sequencing batch reactors on continuous 12-h 100 cycles with intermittent aeration for 34 d, receiving wastewater from a soybean processing 101 company in Singapore. Over the course of three months, nine 20-L carboys of wastewater 102 from soybean soaking were collected at seven different occasions. Initially, two reactors were 103 operated to test whether biomass could be enriched directly from soybean processing 104 wastewater. Afterwards, a set of four reactors was operated to see if biomass could be again 105 enriched directly from different batches of soybean processing wastewaters, and if having a 106 starting inoculum would yield better SCP production than starting without it, receiving the 107 same wastewater feed. Hence, four SBRs were operated without a starting inoculum: F₁₋₂, F₃, 108 F₄₋₅, and F₆₋₇, whereas reactors IF₄₋₅ and IF₆₋₇ were started using 1.5-L inoculum from F₃ after 109 43 days. Subscript numbers indicate the wastewater batch used as feed. Reactors IF₄₋₅ and 110 IF₆₋₇ were comparable to reactors F₄₋₅ and F₆₋₇, respectively, which were fed with identical 111 batches of wastewater but did not have a starting sludge inoculum.

112 2.2 Operational parameters and bioreactor arrangement

The reactor temperature was maintained at 30°C and sludge was continuously mixed at 375 rpm. Feeding phase occurred during the initial 5-10 min of a cycle, followed by alternating 180 min anoxic/anaerobic and 540 min aerobic phases. Cycles finished once soluble chemical oxygen demand (sCOD) of the mixed liquor was measured to be less than 400 mg/L, after which time the biomass was left to settle for 60 min and 1.85 L of

118 supernatant was discarded. Thereafter, the reactor was filled with the same volume of 119 soybean wastewater, starting a new cycle. This feeding scheme resulted in the following 120 average hydraulic residence time (HRT) values for the six bioreactors operated: 9.7 d (F_{1-2}), 121 14.6 d (F_3), 8.4 d (F_{4-5}), 8.4 d (IF_{4-5}), 8.4 d (F_{6-7}) and 8.4 d (IF_{6-7}) (details in supplementary 122 information). The pH ranged from 6.0 to 8.5 and the dissolved oxygen (DO) concentration 123 was controlled between 0.2 and 0.5 mg/L during the aerobic phase. Each of the SBRs 124 employed in this study was equipped with a magnetic stir plate to ensure mixed liquor 125 homogeneity, a pair of EasySense pH and DO probes with their corresponding transmitters 126 (Mettler Toledo), a dedicated air pump, a dedicated feed pump, a solenoid valve for 127 supernatant discharge, and a surrounding water jacket connected to a re-circulating water 128 heater. The different portions of the cycle were controlled by a computer software 129 specifically designed for these reactors (VentureMerger, Singapore). Water chemical 130 analyses were done as described in Santillan et al. (2021) (details in SI).

131 2.3 Biomass protein analysis

132 The protein content of the biomass was determined by quantifying amino acids using 133 high-performance liquid chromatography (HPLC). First, 0.05 g of freeze-dried biomass was 134 mixed with 5 mL of 6 M HCl and flushed with nitrogen gas for about 50 s. Then the samples 135 was digested using heating block at 110°C for 22 h followed by filtration with a 0.22 µm 136 membrane filter after cooling down. The solution was vacuum evaporated to dryness at 38 °C 137 and 25 Pa in a rotary evaporator and re-dissolved in a volumetric flask with 5 mL of 0.1 M 138 HCl. It was centrifuged for 40 min at 10,000 g and 4°C. The supernatant was filtered using a 139 0.22 µm membrane filter and the filtrate maintained at 4°C until derivatization (Chen et al., 140 2019). Pre-column derivatization was used with o-phthalaldehyde and 9-141 fluorenylmethoxycarbonyl (FMOC-Cl) via an autosampler (SIL -30 AC Autosampler). Seven 142 and a half microliter of sample or standard was mixed with 45 μ L of mercaptopropionic acid

and 22 μ L of OPA for 1 min in online derivatization. After mixing 8 μ L of FMOC for 2 min, 5 μ L of 0.1 M HCl was added. The reaction mixture was injected into an HPLC (Prominence UFLC, Shimadzu, Japan) equipped with a UV diode array detector (DAD, SPD-M20A), and detected at a wavelength of 338 nm for primary and 266 nm for secondary amino acids after passage through a Shimadzu Shim-pack Scepter C18 column (3 μ m, 3.0 X 150 mm). The flow rate was adjusted to 0.8 mL/min and the column temperature was set to 40°C. Gradient programs were applied for HPLC analysis.

150 2.4 Microbial analysis

151 Each soybean wastewater feed batch was subsampled once for microbial analysis and 152 sludge samples were collected thrice a week from each reactor. A 50-mL feed sample was 153 centrifuged at 10000 rpm for 3 min and 45 mL of supernatant discarded resulting in a tenfold 154 increase in biomass concentration. Aliquots of 2 mL of concentrated wastewater and 2 mL of 155 sludge samples were stored in cryogenic vials at -80°C for DNA extraction as previously 156 described (Santillan et al., 2019b). Bacterial 16S rRNA amplicon sequencing was done in two 157 steps as described in Santillan et al. (2020b). Primer set 341f/785r targeted the V3-V4 158 variable regions of the 16S rRNA gene (Thijs et al., 2017). The libraries were sequenced on 159 an Illumina MiSeq platform (v.3) with 20% PhiX spike-in and at a read-length of 300 bp 160 paired-end. Sequenced sample libraries were processed following the DADA2 bioinformatics 161 pipeline (Callahan et al., 2016). DADA2 allows inference of exact amplicon sequence 162 variants (ASVs) providing several benefits over traditional OTU clustering methods 163 (Callahan et al., 2017). Illumina sequencing adaptors and PCR primers were trimmed prior to 164 quality filtering. Sequences were truncated after 280 and 255 nucleotides for forward and 165 reverse reads, respectively, length at which average quality dropped below a Phred score of 166 20. After truncation, reads with expected error rates higher than 3 and 5 for forward and reverse reads were removed. After filtering, error rate learning, ASV inference and denoising, 167

reads were merged with a minimum overlap of 20 bp. Chimeric sequences (0.77% on average) were identified and removed. For a total of 81 samples, 47034 reads were kept on average per sample after processing, representing 52% of the average input reads. Taxonomy was assigned using the SILVA database (v.138) (Glockner et al., 2017). The adequacy of sequencing depth after reads processing was corroborated with rarefaction curves at the ASV level (Figure S1).

174 2.5 Fluorescence in situ hybridization

175 Microbial characterization was further supported by fluorescence in situ hybridization 176 (FISH) using probes for the domain bacteria and selected core SCP taxa. Sludge samples 177 were amended with 4% paraformaldehyde and placed on ice for 2-3 h. The fixed samples 178 were washed with $1 \times$ phosphate-buffered saline (PBS) solution and stored in a mixture of 179 1×PBS and ethanol (1:1) at -20 °C until use. The cells were allowed to dry on microscopic 180 slides and dehydrated in an ethanol series of 50, 80 and 96% for 3 min each. Hybridization 181 buffer (0.9 M NaCl, 20 Mm Tris-HCl, 35% formamide, 0.01% sodium dodecyl sulfate) and 182 probes were added to detect microorganisms of interest. Eubmix (Eub338, Eub 338ll, Eub 183 338lll) targets most bacteria (Daims et al., 1999) and AZOI 655 probe targets species 184 belonging to Azospirillum (Stoffels et al., 2001). After hybridization, the slides were washed 185 with warm buffer for 10 min (0.9 M NaCl, 20 Mm Tris-HCl, 5 mM EDTA, 0.01% sodium 186 dodecyl sulfate) and rinsed thoroughly with cold water. FISH images were acquired using a 187 LSM780 confocal laser scanning microscope. The Zen software was used for image 188 processing and graphical analysis (Carl Zeiss, German).

189 **3. Results and Discussion**

190 *3.1 Microbial composition of influent wastewaters*

191 Microbial characterization of the influent food-processing wastewaters helps to 192 identify microorganisms that could potentially drive the microbial community-based SCP

193 production (Vethathirri et al., 2021). The different batches of soybean-processing 194 wastewaters used in this study had a similar microbial community, which was dominated by 195 the phylum *Firmicutes* at a relative abundance of $96 \pm 6.7\%$ (Figure 1a). At a finer taxonomic 196 level, *Lactococcus* and *Weissella* were the most abundant genera at relative abundances of 45 197 + 16.6% and 36 + 16.6%, respectively (Figure 1b). Strains of *Lactococcus* are used in cheese 198 making and can produce vitamins such as B2 and K2 (Song et al., 2017), and Weissella has 199 shown potential as a probiotic in food and pharmaceutical industries (Teixeira et al., 2021). In 200 addition, Leuconostoc was identified in all soybean wastewaters at a relative abundance of 201 4.1-15.1% except for the sixth wastewater batch, which at 14 mg/L also had the lowest 202 average sTKN content. The most abundant ASV at the species level was Leuconostoc palmae 203 (up to 6.5% relative abundance). Several strains of *Leuconostoc* are of economic value due to 204 their widespread application in dairy technology (Hemme & Foucaud-Scheunemann, 2004). 205 Besides these three genera, Streptococcus was also found in all wastewater batches at a 206 relative abundance of up to 16%. Streptococcus thermophilus is important in dairy industries 207 that produce milk, cheese, and yogurt (Mora et al., 2002). Lactobacillus, Enterobacter, 208 Aeromonas, and Acinetobacter occurred less frequently in influent wastewaters at a relative 209 abundance greater than 1% included (Figure 1b). Lactobacillus can be used as a probiotic to 210 cure several ailments, especially chronic liver diseases (Jeong et al., 2022), and strains of Lactobacillus rhamnosus, Lactobacillus casei and Lactobacillus plantarum may be explored 211 212 as a source of natural antioxidants (Shori et al., 2022). Certain species of free-living 213 Enterobacter, specifically Enterobacter cloacae, were found to be involved in symbiotic 214 nitrogen fixation in plants such as wheat (Ji et al., 2020). Studying the microbial communities 215 of influent wastewaters can also help spot potentially pathogenic Aeromonas strains 216 associated with disease in humans and aquatic animals (Fernandez-Bravo & Figueras, 2020). 217 In conclusion, the microbial characterization of influent wastewaters revealed low variability

across batches and identified several taxa suitable for the potential production of both SCPand other valuable compounds.

220 3.2 Wastewaters with a lower sCOD:sTKN (C:N) and higher sTKN produced more SCP

221 While the microbial communities of different batches of soybean-processing 222 wastewaters were similar at the phylum level, the chemical composition was variable, 223 particularly the nitrogen content. The sTKN and sCOD:sTKN values were in the range of 13 224 -110 mg/L and 74 - 187, respectively, for the seven batches of wastewaters collected at 225 different time points from the same soybean processing source (Table 1). According to the 226 wastewater provider, this variability could be due to changes in the quantity of soybeans 227 soaked in water for washing and the source of the soybeans being processed. In general, the 228 darker the color of soybean-processing wastewater, the higher the sTKN level and the lower 229 the sCOD:sTKN value, increasing its potential for SCP production (Vethathirri et al., 2021). 230 To account for the variable N content in different batches of wastewater used in this study, 231 we characterized them as either low (L) for sTKN = 13 - 61 mg/L or high (H) for sTKN = 62232 - 110 mg/L) (see Tables 1 and 2).

233 The biomass in the six community-based SCP reactors was tracked as total suspended 234 solids (TSS) concentration for 34 days (Figure 2a). The initial average biomass concentration 235 of the four reactors that started without inoculum was the same as the average TSS of the 236 soybean wastewater batches (233 mg/L), whereas the other two reactors that received 237 inoculum had an initial average TSS of 575 mg/L. Despite having started without inoculum, 238 reactor F_3 showed a higher TSS concentration of 1967 mg/L on d34 than its offspring 239 reactors IF₄₋₅ and IF₆₋₇, which started with an inoculum produced from F_3 . We attribute this 240 difference to the favorable chemical characteristics of the wastewater batch used for F_3 , which 241 had high sTKN levels and a low sCOD:sTKN compared to other feeds (Table 2). On the 242 other hand, the lowest TSS value on d34 was 227 mg/L, observed in reactor F₁₋₂, which was

243 initiated without inoculum. Further, this was also the only reactor that showed a declining 244 trend in cell growth in the second half of the experiment (Figure 2a). This was due to the low 245 sTKN level in the wastewater batch (31 mg/L) that was used after d24, which then affected 246 the overall biomass production rate and yield (Table 2) of reactor F_{1-2} . Although this batch 247 had the lowest sCOD:sTKN of all the batches (Table 2), it did not support cell growth with 248 the feeding regime used in this study. Hence, both a lower sCOD:sTKN and a sufficiently 249 high sTKN concentration are needed to sustain community-based microbial biomass 250 production.

251 Amino acid analysis by HPLC was used to accurately determine protein levels in the 252 dry microbial biomass (FAO, 2003; Vethathirri et al., 2021). The amount of protein in the 253 biomass followed the pattern of TSS production (Figure 2a), with increasing or decreasing 254 trends depending on the wastewater batch used in each bioreactor at a particular time of the 255 study. An increase in biomass protein content was observed in reactor $F_{1,2}$ from d1 to d23, in 256 F_3 from d1 to d34, in F_{6-7} from d22 to d34, and in IF_{6-7} from d22 to d34 due to the usage of 257 feed wastewaters with a lower sCOD:sTKN and higher sTKN content (62 - 110 mg/L) 258 (Figure 2a). A similar pattern was observed with other types of mixed-culture SCP biomass 259 produced from photosynthetic bacteria using artificial sugar wastewaters of lower COD:TN 260 (5 to 50) (Cao et al., 2021). On the other hand, biomass protein content was decreasing or 261 stayed constant in reactors F_{1-2} (d24 to d34), F_{4-5} (d1 to d34), IF_{4-5} (d1 to d34), F_{6-7} (d1 to 262 d21), and IF_{6.7} (d1 to d21) due to the usage of wastewaters with a higher sCOD:sTKN and 263 lower sTKN content (13 - 61 mg/L) (Figure 2a) in our study. Hence, when reactors received 264 wastewater with a lower sCOD:sTKN and a higher sTKN content, they produced 265 significantly more biomass and protein (two-tailed Welch's t-tests, p < 0.0001) than when 266 they were fed with wastewater that had a high sCOD:sTKN and low sTKN content (Figure 267 2b).

268 The protein content in the microbial biomass is important for fish feed applications 269 (Azim et al., 2008; Webster & Lim, 2002). Higher protein contents of 49.9, 49.5 and 48.7% 270 as dry biomass were observed in reactors IF₄₋₅, F₁₋₂, and F₄₋₅, respectively (Figure S2), 271 regardless of the presence or absence of an initial inoculum. Similar protein percentages were observed in aerobic heterotrophic biomass produced from different food processing 272 273 wastewaters (Muys et al., 2020). However, they were lower than reported values for other 274 types of SCP biomass. For instance, purple non-sulfur bacteria (PNSB) growing on volatile 275 fatty acids had a maximum protein content of 61% as dry cell weight (Peng et al., 2022), 276 although this was measured with the modified Lowry method. Colorimetric protein assays, 277 like the modified Lowry and Biuret methods, are not recommended for assessing the protein 278 content in SCP production studies (Vethathirri et al., 2021) because they are susceptible to 279 interferences that often lead to erroneous readings (Le et al., 2016). Lower protein contents of 29.3% and 29.1% as dry biomass were observed in reactors F₆₋₇ and IF₆₋₇, respectively, 280 281 (Figure S2) towards the end of the study due to the usage of wastewater with a higher 282 sCOD:sTKN and lower sTKN content until d29, despite the shift to a wastewater feed with a 283 higher sTKN content afterwards (Table 2). Additionally, none of the reactors had a constant 284 protein fraction during the bioconversion period, including reactor F_3 which was fed with the 285 same wastewater batch throughout the study. Our data showed that the highest protein 286 fraction (~ 50%) was achieved during 15 to 25 days.

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3.3 Microbial community-based protein meets amino acid requirement for aquaculture feed

The SCP produced using several batches of soybean wastewaters either completely or partially met the demand of essential amino acids (EAA) in the aquaculture diet of trout (Ogino, 1980) and shrimp (Tacon et al., 2002) (Figure 3). Ten amino acids are regarded essential, because they are not produced by these aquaculture animals and thus need to be supplemented as part of their diet (Millamena, 2002). Microbial biomass produced in the six

293 bioreactors had an EAA content of $38.8 \pm 2.0\%$ in protein and featured all EAAs, except for 294 tryptophan which was not measured. Among them, leucine was found to be the most enriched 295 in all bioreactors (9.2 \pm 0.6% of protein). Leucine is a valuable branched chain amino acid 296 supporting the growth, maintenance, metabolic, and physiological needs of fish (Ahmad et 297 al., 2021). The dry biomass produced using seven distinct batches of soybean wastewaters 298 was also rich in aspartic acid, glutamic acid, and alanine (Figure S3 and Figure S4). The same 299 amino acids were also dominant in the existent microbial community (measured as dry cell 300 mass) in soybean-processing wastewater (Figure S5). SCP produced from industrial 301 wastewaters was reported to be suitable for replacing, at least partially, conventional fish 302 meal (Hülsen et al., 2018b; Muys et al., 2020). When SCP produced from purple bacteria was 303 used as shrimp feed, the animals exhibited higher tolerance of Vibrio pathogens and 304 resistance to ammonia stress compared to a control group fed on conventional fish meal 305 (Alloul et al., 2021b). Further, palatability of the microbial community-based SCP can be 306 promoted by adding attractants or feed stimulants like betaine and free amino acids (Ajiboye 307 et al., 2012) or by using feed additives like onion powder (Anwer et al., 2018). Hence, SCP 308 produced by the growth of microbial communities can potentially be used as a protein source 309 in the feed of aquaculture animals.

310 3.4 Impact of inoculum on microbial community-based SCP production

Microbial community-based synthesis of single cell protein from wastewaters has generally involved inoculation with a seed culture derived from previous experiments (Hülsen et al., 2018a; Hülsen et al., 2018b; Hülsen et al., 2020). In the present study, two out of six bioreactors received 1.5 L of a mixed microbial community that grew in a prior SCP experiment using the same source of soybean-processing wastewater. sCOD removal efficiencies (R_{sCOD}) in these reactors, IF₄₋₅ ($R_{sCOD} = 93\%$) and IF₆₋₇ ($R_{sCOD} = 93\%$), were like those in their corresponding reactors, F₄₋₅ ($R_{sCOD} = 94\%$) and F₆₋₇ ($R_{sCOD} = 93\%$),

318 respectively, which were operated without inoculum but received the same batches of 319 soybean processing wastewater (Table 2). In contrast, the sTN removal efficiency (R_{sTN}) of 320 only one reactor, IF_{4-5} ($R_{sTN} = 74\%$), was comparable to that of its counterpart reactor, F_{4-5} 321 $(R_{sTN} = 75\%)$, whereas the sTN removal efficiency (R_{sTN}) of the other reactor, IF₆₋₇ $(R_{sTN} =$ 322 88%) was higher than that in its counterpart reactor, F_{6-7} ($R_{sTN} = 59\%$). We attribute this 323 difference to the high-quality wastewater (sTKN = 80 mg/L) used to feed reactors F_{6-7} and 324 IF₆₋₇ from d29 to d34. Hence, inoculated reactors exhibited a higher nitrogen removal 325 efficiency when the feed was high in sTKN and had a low sCOD:sTKN. Further, the impact 326 of a seed inoculum on cell growth and protein synthesis can be explained by performance 327 metrics such as yield and production rate (Table 2). Thus, a starting inoculum enriched from 328 an existent community in the food-processing wastewater can provide microbial populations 329 able to grow using the carbon sources and nutrients present, thus enhancing the rate of mixed-330 community SCP production.

331 *3.5 Distinct microbial communities enriched from wastewater batches of variable quality*

332 The most enriched SCP genera in reactors included Azospirillum, Rhodobacter, 333 Lactococcus, and Novosphingobium (Figure 4). Except for Lactococcus, the other three main 334 genera belonged to the phylum *Proteobacteria*, which is the predominant phylum reported in 335 microbial community-based SCP production systems (Vethathirri et al., 2021). Although 336 Firmicutes was the most prevalent phylum in the soybean processing wastewaters, 337 Proteobacteria became dominant in the enriched microbial biomass in the reactors. 338 Therefore, the massive immigration of bacteria present in the influent did not determine the 339 structure of the microbial community in the reactors, contrary to what has been reported for 340 full-scale activated sludge plants (Dottorini et al., 2021). A similar observation was made in a 341 full-scale membrane bioreactor plant where the influent bacterial populations contributed 342 little to relative abundances of the core activated sludge community (Zhang & Meng, 2021).

343 The observed shift in the microbial community composition in our study was likely due to 344 selection conditions imposed by the available nutrients in the soybean-processing 345 wastewaters and the operational conditions in the reactors (Santillan et al., 2020a; Santillan et 346 al., 2019b; Seshan et al., 2021). Further, the reactors that operated without a starting inoculum (F_{1-2} , F_3 , F_{4-5} , F_{6-7}), and received different batches of soybean processing 347 348 wastewaters as feed, differed in the three most abundant bacterial genera after 34 days 349 (Figure 4), despite having a similar initial community dominated by Lactococcus and 350 Weisella. This highlights the effect of variable chemical characteristics of the influent 351 wastewaters on the selection of core SCP communities in the bioreactors. Similarly, the two 352 reactors that received the same sludge inoculum (IF_{4-5} , IF_{6-7}) with high relative abundances of 353 the genera Azospirillum and Lactococcus, had enriched different bacterial genera after 34 354 days. These two reactors were fed different batches of soybean-processing wastewaters, 355 which had a different chemical composition (Table 1). The two main genera in the reactors 356 on d34 were Rhodobacter and Ignavibacterium and Novosphingobium and Zoogloea, 357 respectively, also differing from the main genera in the influent wastewaters. Likewise, 358 Lactococcus, which was the predominant genus in influent wastewaters, was not among the 359 core SCP microbial communities except for two reactors (F₁₋₂ and F₆₋₇) that were fed with 360 different wastewater batches. Similarly, Weissella, which was the second most abundant 361 bacterial genus in the soybean wastewaters, was not enriched in any of the reactors. Taken 362 together, these data suggest that organisms present in the influent wastewaters at low relative 363 abundances (which may be below the limit of detection) can be enriched if provided 364 appropriate selective conditions.

365 *3.6 Enriched taxa with potential applications other than SCP production*

366 Microbial community-based SCP production using food processing wastewaters may 367 also lead to the enrichment of taxa that can produce valuable compounds or have further

368 applications in addition to microbial protein production (Vethathirri et al., 2021). Following 369 the shift from high (110 mg/L) to low (31 mg/L) sTKN in reactor F_{1-2} , the relative abundance 370 of Azospirillum increased from 2.0% to 53.6%. Their dominance could be due to low oxygen 371 and nitrogen levels, which favor the growth of diazotrophs (Lee et al., 2015). FISH imaging 372 further confirmed the presence of rod-shaped Azospirillum cells in the SCP community 373 (Figure 5). Some taxa within the Azospirillum genus can both fix nitrogen (Fukami et al., 374 2018) and promote plant growth by synthesizing phytohormones and other valuable 375 compounds that improve root growth and uptake of nutrients. A similar enrichment of 376 Azospirillum to that of reactor F_{1-2} was observed in reactor F_{4-5} , which was also started 377 without inoculum and was fed with two wastewater batches of low sTKN content. 378 Azospirillum was further identified as the most abundant bacterial genus in reactor F_3 , despite 379 it having received wastewater with a high sTKN level of 110 mg/L throughout the 34-d 380 experiment. This could have been due to the higher TSS level of 1160 mg/L from day 18 381 onwards in F₃ compared to the other reactors, which translated into higher biomass 382 production and use of available nitrogen. Reactor IF₄₋₅ received a seed inoculum in the 383 beginning and favored Azospirillum until d28, but its relative abundance decreased drastically 384 from 66% to 0.2% after the change to a different wastewater batch of higher quality. The 385 latter helped in the enrichment of the other two genera, Rhodobacter and 386 Acidipropionibacterium, in reactor IF₄₋₅ from d28 to d34. The different enrichment patterns 387 of Azospirillum in the six reactors emphasize the impact of chemical variability of 388 wastewaters from the same food processing industry on microbial composition of microbial 389 community-derived SCP. Further, nitrogen-fixing bacteria like *Azospirillum* could help in the 390 SCP production from nitrogen-limited wastewaters, with the added value of a low dissolved 391 oxygen requirement.

392 Acidipropionibacterium was among the three most enriched genera in reactors F_3 and 393 IF_{4-5} . Previously named *Propionibacterium*, taxa within this genus have a wide range of 394 applications in the food and pharmaceutical industries due to their ability to produce vitamin 395 B12, trehalose, and bacteriocins via cell growth and synthesis of organic acids (Piwowarek et 396 al., 2018). Some species within this genus, including Acidipropionibacterium acidipropionici 397 (present in the reactors), play a major role in the food industry as either bio-preservatives or 398 potential probiotics because of their generally recognized as safe (GRAS) status (Deptula et 399 al., 2019). The genus *Novosphingobium* that was prevalent in reactor IF_{6-7} includes emerging 400 diazotrophic strains capable of promoting rice cultivation in the absence of a nitrogen source 401 (Rangjaroen et al., 2017). Novosphingobium nitrogenifigens and Novosphingobium 402 sediminicola, which were both identified at the species level in the reactor, have been shown 403 to accumulate polyhydroxyalkanoates when growing on nitrogen deficient pulp and paper-404 mill effluent (Addison et al., 2007), and to achieve high N levels facilitating the growth of the 405 sugarcane plant in N-free sands (Muangthong et al., 2015), respectively. Another abundant 406 organism from the same reactor, Zooglea resiniphila, has been found to enhance the removal 407 of major resin acid toxicants in pulp and paper-mill effluents after bioaugmentation (Yu & 408 Mohn, 2002). The most enriched species in reactor IF_{4-5} , Rhodobacter gluconicum, was 409 reported to be a dominant soil microbe involved in electricity generation in plant microbial 410 fuel cells (Maddalwar et al., 2021). Ignavibacterium, another abundant genus specific to this 411 reactor, was reported to be involved in the degradation of aromatic compounds in 412 petrochemical wastewater effluents (Wang et al., 2021).

413 *3.7 Limitations of the study*

The overall protein production rates attained in this study were lower than those reported in prior studies on SCP production. The highest protein production rate occurred in reactor F_{6-7} (0.011 g SCP/L_R/d) and was about 19 times lower than the rate reported for

417 photosynthetic bacteria using artificial sugar wastewater with a COD:TN of 5 (Cao et al., 418 2021). Similarly, the highest biomass yield, also from reactor IF₆₋₇ (0.089 g TSS/g sCOD_{feed}), 419 was ten times lower than that of photosynthetic nonsulfur bacteria produced using a volatile 420 fatty acid-based medium with a COD:TN of 17 (Peng et al., 2022). These differences could 421 be due to the use of synthetic wastewater with a controlled low C:N in those studies 422 compared to the real food-processing wastewaters of varying C:N used here. Further, the 423 sCOD:sTKN values of the soybean wastewaters batches used in this study (Table 2) were 424 much higher than the recommended elemental C:N values (10 to 20) for microbial 425 community-based SCP production (Vethathirri et al., 2021). The frequency of feeding was 426 low, since time was required for the existent microbial communities in the wastewaters to 427 grow before a new batch of feed was added. Additionally, a well-defined mixed-culture 428 inoculum selected on specific substrates could have enhanced the production rate and yield. 429 Hence it is plausible that a longer enrichment period on soybean-processing wastewaters 430 would have resulted in a more effective inoculum.

431 *3.8 Future directions to enhance SCP production from food-processing wastewaters*

432 Further optimization of operational parameters to enhance SCP production and, 433 specifically, accumulation of essential amino acids, is desirable. We observed an average of 434 92% of sCOD and 73% of sTN removal (Table 2). The current feeding scheme was chosen to 435 provide adequate time for building microbial biomass from soybean processing wastewater in 436 SBRs. Future experiments starting with a previously enriched sludge inoculum may employ a 437 more frequent feeding regime to increase the supply of carbon and nitrogen for cell protein 438 A similar strategy increased the production rate of intracellular synthesis. 439 polyhydroxyalkanoates tenfold, using volatile fatty acids as feed under aerobic conditions 440 (Valentino et al., 2014). Additionally, microbial communities can produce other valuable 441 compounds like vitamins and co-enzyme Q10 (Peng et al., 2022) through bioconversion of

442 nu	itrient-rich s	vnthetic	wastewaters.	Therefore.	process	parameters	mav	be	tweaked	to	allov
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the production of value-added microbial products as well as single-cell protein.

444 **4.** Conclusions

- Soybean-processing wastewater can be converted into SCP meeting aquaculture feed
 requirements through a mixed-community bioreactor bioconversion approach.
- SCP can be produced using the microbial communities already present in the food processing wastewaters, although SCP production is higher when reactors are inoculated
 with a suitable mixed-community culture.
- Variable sTKN levels and sCOD:sTKN in the food-processing wastewaters result in
 distinct SCP microbial communities, regardless of the similar microbial composition of
 the influent.
- Taxa at low abundance in the wastewaters can grow into core SCP producing organisms
 under suitable process conditions.
- Microbial community-based bioconversion of food-processing wastewaters into SCP can
 enrich for taxa with the potential to promote plant growth, have probiotic effects, and
 produce valuable compounds like vitamins.

458 Data availability

DNA sequencing data are available at NCBI BioProjects PRJNA832086. See supplementary information for details about chemical analysis, microbial protein yield and production, nutrient removal efficiency and HRT estimation, chemical characteristics of bioreactor effluent and influent, rarefaction plots for 16S rRNA gene sequencing data, biomass protein content (as % dry weight), temporal amino acid profiles in reactors, amino acid profile in dry biomass of wastewater, and temporal dynamics of the 20 most abundant genera in each reactor.

466 Author Contributions

467 RSV, ES and SW conceived the study. RSV and ES designed the experiment. SW obtained 468 the funding for the study. RSV performed the experiment. RSV and SST did the laboratory 469 chemical analyses. HYH and ES performed the molecular work. ES did the bioinformatics 470 analyses. RSV and ES interpreted the data, generated the results, and elaborated the main 471 arguments in the manuscript. RSV, ES and SW wrote the manuscript. All authors reviewed 472 the manuscript.

473 Competing interests

474 The authors declare no competing interests.

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Soybean wastewater batch ^a (quality) ^b	sCOD [mg/L]	sTKN ^c [mg/L]	sPO ₄ ³⁻ -P [mg/L]	NH4 ⁺ -N [mg/L]	NO2⁻-N [mg/L]	NO3⁻-N [mg/L]	TA ^d [mg/L]	TSS [mg/L]	VSS [mg/L]	рН	C: N (sCOD: sTKN ^{)e}	N:P (sTKN: $sPO_4^{3}P)^{e}$
1 (H)	9038	110	67	5.9	0.08	13.65	453	90	90	5.90	82.5	1.6
2 (L)	2334	31	17	3.1	0.04	1.88	57	140	140	4.80	74.3	1.9
3 (H)	8945	110	65	9.0	0.32	8.4	208	530	480	4.80	81.3	1.7
4.1 (L)	5670	50	21	6.42	0.01	0.00	206	210	210	5.39	112.0	2.4
4.2 (L)	4180	28	18	4.07	0.00	0.09	138	310	310	5.28	147.0	1.6
5 (L)	3474	34	14	3.40	0.00	0.02	118	160	160	5.04	101.8	2.5
6.1 (L)	2494	13	8	1.28	0.00	0.37	39	150	150	4.90	186.9	1.7
6.2 (L)	2501	15	8	1.11	0.01	0.31	34	180	180	4.85	166.2	1.9
7 (H)	7663	80	29	5.26	0.00	0.07	254	330	330	4.70	96.1	2.8

690 **Table 1** – Chemical characteristics of soybean processing wastewaters used for microbial community-based SCP production.

^a A total of nine 20-L carboys were collected at seven different time points over three months.

^b High quality (H) for sTKN = 62 - 110 mg/L and low quality (L) for sTKN = 13 - 61 mg/L.

 c sTKN was calculated using the value of sTN, nitrate and nitrite: sTKN = sTN – nitrate - nitrite.

694 ^d Total alkalinity expressed as calcium carbonate

^eRatio of carbon and nitrogen in wastewater as calculated from chemical data.

Reactor	Day	Waste water batch (quality) ^a	sTKN [mg/L]	C: N [sCOD: sTKN]	Biomass production rate [g TSS/L _R /d] ^b	Biomass yield_sCOD [g TSS/g sCOD]	Biomass yield_sTKN [g TSS/g sTKN]	Protein production rate [g SCP/L _R /d]	Protein yield_sCOD [g SCP/g sCOD]	Protein yield_sTKN [g SCP/g sTKN]	R _{sCOD} ^c [%]	R_{sTN}^c [%]
F ₁₋₂	1 - 23 $24 - 34$	1 (H) 2 (L)	110 31	82.5 74.3	0.005	0.006	0.49	0.006	0.007	0.53	87	74
F ₃	1-34	3 (H)	110	81.3	0.042	0.053	4.28	0.010	0.012	1.00	90	68
F ₄₋₅	1 - 14 15 - 29 30 - 34	4.1 (L) 4.2 (L) 5 (L)	50 28 34	112.0 147.0 101.8	0.013	0.021	2.55	0.004	0.007	0.82	95	75
IF ₄₋₅ ^d	1 - 14 15 - 29 30 - 34	4.1 (L) 4.2 (L) 5 (L)	50 28 34	112.0 147.0 101.8	0.021	0.036	4.44	0.006	0.011	1.37	93	74
F ₆₋₇	1 - 14 15 - 29 30 - 34	6.1 (L) 6.2 (L) 7 (H)	13 15 80	186.9 166.2 96.1	0.039	0.083	11.06	0.011	0.024	3.13	93	59
IF ₆₋₇ ^d	1 - 14 15 - 29 30 - 34	6.1 (L) 6.2 (L) 7 (H)	13 15 80	186.9 166.2 96.1	0.040	0.089	11.64	0.009	0.021	2.76	94	88

696 **Table 2** –Microbial community-based SCP production through bioconversion of soybean processing wastewaters.

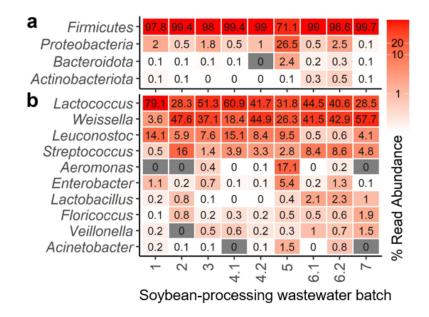
^a High quality (H) for sTKN = 62 - 110 mg/L and low quality (L) for sTKN = 13 - 61 mg/L.

^b L_R = reactor volume in liters. All reactors had a working volume of 4.5 L.

^c Average nutrient removal efficiency calculated for each reactor based on feed and effluent characteristics (Table S1).

^d Reactors IF₄₋₅ and IF₆₋₇ received a 1.5-L inoculum from reactor F₃, while reactors F₁₋₂, F₃, F₄₋₅ and F₆₋₇ were started without inoculum.

701 Subscript numbers indicate the wastewater batch used as feed.



702

Figure 1. Microbial characterization of influent soybean processing wastewaters used for microbial community-based SCP production as assessed through 16S rRNA gene amplicon sequencing (n = 9). (a) Four most abundant phyla and (b) ten most abundant genera of nine wastewater batches were collected at seven different time points over three months.

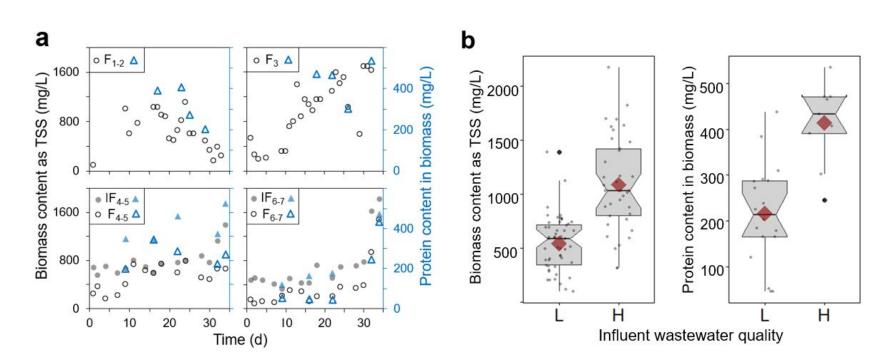
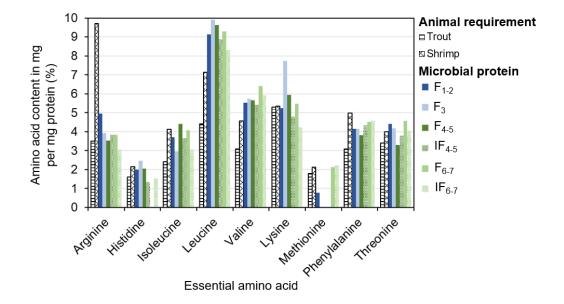


Figure 2. Biomass growth, biomass protein content and influent wastewater quality impact in six SCP-enriched bioreactors. (a) Biomass measured as total suspended solids (TSS, black circles), and protein content in the biomass via amino acid quantification using HPLC (blue triangles). Four reactors (F_{1-2} , F_3 , F_{4-5} , and F_{6-7}) were initiated without inoculum and two (IF_{4-5} and IF_{6-7}) received a 1.5-L inoculum from reactor F_3 (subscript numbers indicate the wastewater batch used as feed). (b) Box plots of biomass content and protein content in biomass for low (L, sTKN = 13 - 61 mg/L) and high (H, sTKN = 62 - 110 mg/L) quality feed. Only data from day 5 onwards were included to exclude low TSS values during the reactor start-up period. Red diamonds display mean values and notches show the 95% confidence interval for the median; when notches do not overlap the medians can be judged to differ significantly (two-tailed Welch's t-tests, p < 0.0001).



716 Figure 3. Essential amino acids in microbial community-based single cell protein produced 717 from soybean processing wastewaters (solid/pattern-filled blue/green bars) and compared to 718 the minimum requirements for trout and shrimp feed (pattern-filled black bars). Data 719 available in Ogino (1980) and Tacon et al. (2002) were used to plot the minimum essential 720 amino acid requirements of trout and shrimp, respectively. Four reactors were initiated 721 without inoculum: F₁₋₂ (solid-filled dark blue bar), F₃ (solid-filled light blue bar), F₄₋₅ (solid-722 filled dark green bar), and F₆₋₇ (solid-filled light green bar). Two reactors received a 1.5-L 723 inoculum from reactor F₃: IF₄₋₅ (pattern-filled dark green bar) and IF₆₋₇ (pattern-filled light 724 green bar). Subscript numbers indicate the wastewater batch used as feed. Data used for F₁₋₂ 725 and F_3 correspond to samples collected on d29 and d32, respectively, while data used for the 726 remaining reactors correspond to d34.

F ₁₋₂	F ₃	F ₄₋₅	IF ₄₋₅	F ₆₋₇	IF ₆₋₇							
Azospirillum - 0 0.1 1.2 2 2	6.9 53.6 0 0 0.4 2.5 2.3 15.8		27.7 73 8 69 5 46 7 66 0.2	0 5.4 43.2 2.2 0.7 0.5	33.2 67.8 1.1 1.3 8.8 0							
	2 5.7 53.1 15.8 11.1 3.1 7.3 2.3		28.7 2.7 1.7 16.7 0.2 2	40.8 9.3 3.4 29.8 0.2 15.8	18.9 0.1 0.2 22.4 0.2 4.8							
Weissella - 4.5 0.1 0.1 0.1 0	.2 1.1 36.1 12.3 5.2 0.7 3.8 0.7	25.5 0.8 2 0.4 0 0.1	10.3 0.9 1 1.6 0.1 0.2	44.4 0.7 0.2 3 0.2 2.9	11.2 0 0 4.9 0.1 0.7	-20-						
Veillonella - 0.4 34.5 2.7 16.8 3	.3 0.2 0.5 28.2 18.1 6.2 0.5 0	1.1 9.1 2.1 0.1 0 0	0.3 0 0 0.1 0.1 0	1.5 7.4 0.3 0.4 0 0	0.8 0 0 0.1 0 0	10						
Klebsiella - 0.4 0.9 3.1 4.8 1	.3 0.5 0 1.4 13 9.3 20 7	0 2.4 33.6 2 0.3 1.2	2.7 0 0.3 3.5 0.4 0.9	0 0 0.2 1.2 0.5 2.4	2.8 0 0.3 0.3 0.2 1.4							
Corynebacterium - 0 8.3 38.1 21.4 2	3.8 4.5 0 0 0.3 0.4 0.8 2.1	0.1 0 0 0 0 0	0.2 0.1 0.1 0 0 0	0.1 0 0 0.1 0 0	0.2 0.1 0 0 0 0	- 1 -						
	.2 5.5 0 4.3 0.2 0.1 0.1 0.1	0.1 21.3 10.1 0.2 0.3 0.9	0.1 0.4 1.5 0.6 0.6 1.7	0.1 4.3 1.2 0.4 1.8 10.1	0.1 0.4 0.5 0.2 2 15.8							
Ignavibacterium - 0 0 0 0	0 0 0 0 0 0 0.2	0 0 0 0 0	0.9 5.9 6.4 5.1 4.5 3.8	0 0 3.5 6.7 18.4 4.1	1 5.8 2.1 0.7 2 1.4							
	.4 0.3 0 0.1 3.9 7.2 6.3 7	0 0.1 1.4 1 1.1 1.1	1 0.2 0.6 0.4 0.2 3.2	0.1 0.2 1.8 1 1.7 1	0.9 0.2 1 0.5 1.2 1.5	æ						
Leuconostoc - 11.8 0.7 0.7 0.7 0		7.9 1.6 0.7 2.3 0.1 0.2	4.5 0.3 0.6 2.5 0.2 0.7	0.4 0.1 0.1 0.4 0 0.6	0.2 0 0 0.3 0 0.1	Abundance						
Rhodobacter - 0 0 0 0.4 0		0 0 0 0 1.9 2.6	0.4 0.4 0.6 0.8 1.3 10.2	0 0.3 1.2 2.2 5.3 2.1	0.4 1.1 5.3 1.8 3.5 2.3	pc						
Flavobacterium - 0 0 0 1	.1 0.7 0 0 4.1 6 0.8 2.2		0.1 0 0 0 0 0.1	0 5.8 4.8 0.6 0.5 0.3	0.2 0.1 1.1 3 2.1 0.6	JUL						
Comamonas - 0 0.1 1.9 1.2 1			0.6 0.5 0.1 0 0.1 0	0 1.8 0.2 0 0.1 0.2	0.9 0.5 1.7 0.2 0 0.1							
	6 1.2 0 0 0 1.4 1.6 3.4	0 0 0.1 1.5 3 1.1	1.6 2.6 1.8 1.9 1.3 0.8	0 1.4 1.7 1 0.4 0.3	1.9 3.5 1.9 0 0 0.1	ad						
	.2 0.4 1.4 0.1 0 0 0 0	4.6 0.1 0 1.8 0 0.1	2.2 0 0 2.2 0.1 0.6	8.6 0 0 6.2 0 0.1	4.2 0 0 4.5 0 0.1	Read						
Enterobacter - 1.3 0.5 3.8 3.5 1	.1 1.1 1.2 0.9 5.6 1.4 2.7 4.1	0.1 0 0.7 0 0 0.1	2.3 0 0.1 0.1 0 0.1	0.2 0.1 0 0.2 0.1 0.7	2.3 0 0 0.1 0 0.2	%						
	0 3.2 0 0 0 0 0.3 0.2		0 0.5 0.8 0.7 1.7 1.7	0 1 6.5 0.7 0.7 3.4	0.1 0.1 0.2 0.4 0.8 2.3	0.						
		0 0 0 0.1 0.2 0.2	0 0 0 0.2 0.1 1.1	0 0 0 0.7 2.1 2	0 0 0.3 7.8 5.8 11.7							
		0 0 0 0 0 0	0 0 0 0 0 1.7	0 0 0 0.3 2.9 6.9	0 0 0.8 8.3 1.1 9.3							
	0 0 0.3 0.2 0 0	0 0 0.1 2.7 2.2 0.7	0.3 0.4 0.3 0.1 0.1 0.8	0 11.6 0.9 0.5 1.4 0.6	0.2 0.9 2.1 0.6 0.7 1.6							
1 9 17 23 2	29 33 1 5 16 22 27 33		1 7 14 22 28 34	1 7 14 22 28 34	1 7 14 22 28 34							
	Time (d)											

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Figure 4. Microbial characterization based on 16S rRNA gene amplicon sequencing of community-based SCP biomass produced from soybean processing wastewaters. The temporal dynamics of the 20 most abundant bacterial genera across all reactors are shown. Four reactors (F_{1-2} , F_3 , F_{4-5} , and F_{6-7}) were initiated without inoculum and two (IF₄₋₅ and IF₆₋₇) received a 1.5-L inoculum from reactor F_3 (subscript numbers indicate the wastewater batch used as feed). Heat maps were generated using 16S rRNA gene amplicon v3-v4 data; ASVs were grouped at the required taxonomic level and ranked with the most abundant ASV on top. Additional reactor samples were analyzed for high temporal resolution (Figure S6-S8).

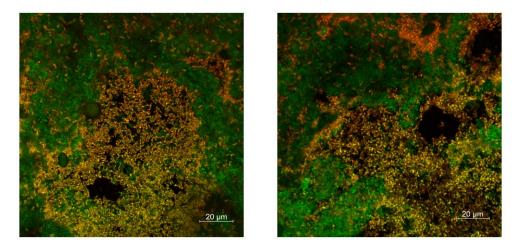


Figure 5. FISH images from reactor IF_{4-5} on d18 showing *Azospirillum* (orange) and all bacterial (green) cells. Cell abundances are consistent with 16S rRNA gene amplicon sequencing data for *Azospirillum* in IF_{4-5} on d18 indicating a relative abundance of 75.3%. Reactor IF_{4-5} had an inoculum from prior SCP production (reactor F_3) and received batches 4 and 5 of soybean processing wastewater as feed. FISH images showing *Azospirillum* were also obtained from other reactors (Figure S9).