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Lars Andre Langøyli Giske, Emil Bjørlykhaug, Trond Løvdal, Ola Jon Mork

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Experimental study of effectiveness of robotic cleaning for fish-processing plants

- 3
- 4 Lars Andre Langøyli Giske^{a,b,#}, Emil Bjørlykhaug^{b,#}, Trond Løvdal^c, Ola Jon Mork^d

5 ^aOptimar AS avd. Stranda, Svemorka Industriområde, Stranda, Norway

- 6 ^bDepartment of Mechanical and Industrial Engineering, NTNU, S. P. Andersens vei 5, Trondheim,
- 7 Norway
- 8 ^c Department of Process Technology, Nofima Norwegian Institute of Food, Fisheries and Aquaculture
- 9 Research, Richard Johnsens gate 4, Stavanger, Norway
- 10 ^dDepartment of Ocean Operations and Civil Engineering, NTNU, Larsgaardsveien 2, Aalesund, Norway
- **11** *#Equal contribution*
- 12

13 Email addresses: lgi@optimar.no(L. A. L. Giske), emil.bjorlykhaug@ntnu.no(E. Bjorlykhaug),

- 14 trond.lovdal@nofima.no(T. Lovdal), ola.j.mork@ntnu.no(O. J. Mork)
- 15

16 **ABSTRACT**

17 This paper presents the development and experimental testing of the effectiveness of a

robotic cleaning system for fish processing plants. The processing of fish introduces a

19 substantial risk of bacterial contamination, which can cause the spoilage of fish and pose a

20 threat to consumers' health. Good operational hygiene and precautions, in addition to regular

cleaning of the processing plants, are necessary for the reduction of the risk of
 contamination. The state-of-the art cleaning techniques currently include manual cleaning

23 operations of fish processing plants. The experiments of robotic cleaning presented in this

- paper were performed in two rounds. First, a test using a conventional low-cost industrial
- robot mounted on a vertical linear axis was used. As the results from this test seemed

26 promising, a second robotic system was built aiming at a more industrialized version. This

system consisted of a serial manipulator, tailored for the task, mounted on a horizontal
 transportation system, and a comparison was conducted between the cleaning performed by

29 human operators and that performed by the robotic system. An electrical stunner with a

30 connected conveyor belt, which is a typical installation for salmon processing plants, was

experimentally inoculated with a cocktail of fish-spoilage bacteria that were allowed to develop a biofilm. Back-to-back cleaning trials with biofilms of *Pseudomonas fluorescens*,

develop a biofilm. Back-to-back cleaning trials with biofilms of *Pseudomonas fluorescens*,
 Pseudomonas putida, and Photobacterium phosphoreum confirmed that the industrialized

robotic prototype performed equally well or better than the conventional manual cleaning

- 35 procedure currently used in the industry. The results demonstrate that a robotic system can
- deliver satisfactory results in the cleaning of fish processing plants, thereby minimizing the
- 37 potential for the spread of contamination. The proposed robotic concept allows for an
- automated cleaning system, reduced human labor, increased profitability for the industry,
- 39 and better stability of the cleaning process.

40 *Keywords:* Robotic cleaning; Fish processing; Serial manipulator; Listeria; Bacteria;

41 Aquaculture Innovation

42 1 INTRODUCTION

In this paper, the results from a research project in the Norwegian aquaculture industry arepresented. The aim of the project is to develop a robotic system for cleaning fish processing

45 plants, whose performance is equal to or better than that of the manual cleaning procedure

46 that is currently followed.

47

48 The Norwegian aquaculture industry has a yearly revenue of over EUR 6 billion for salmon alone (Statistics Norway, 2018). Owing to the fact that there will be an increasing need for 49 protein food sources to accommodate the anticipated growth in population toward 2030 50 (FAO Food and Agriculture Organization of the United Nations, 2016; World Bank, 2013), 51 the salmon aquaculture industry is expected to grow as it is an important protein food source. 52 However, the salmon industry faces critical challenges that may limit its further growth. One 53 of these challenges is the contamination by the human pathogenic bacterium *Listeria* 54 monocytogenes during production; as of yet, the pathogen has not been fully controlled in 55 food production (Buchanan, Gorris, Hayman, Jackson, & Whiting, 2017). This has led to 56 strict requirements from the Norwegian Food Safety Authority (Mattilsynet - The Norwegian 57 Food Safety Authority, 2016), which is the governing body for safe food production in 58 Norway. Additionally, there is an increasing demand for fresh, chilled fish. Microbiological 59 control of spoilage bacteria, such as *Pseudomonas* and *Shewanella*, determines the quality 60 and shelf life of fresh fish (Gram & Huss, 1996; Trond Møretrø, Moen, Heir, Hansen, & 61 62 Langsrud, 2016). In view of these challenges and the anticipated growth of aquaculture, there is a need for the industry to find new ways to improve its procedures in all stages of the value 63 chain, from breeding to slaughtering and processing, including the improvement of the 64 65 cleaning procedures, to reduce the risk of bacterial contamination that may pose a potential risk to human health. 66

67

68 Efforts have been made by researchers and companies to automate and rationalize the

different production processes, such as the use of robots and automated systems in different 69 gripping and handling tasks, slaughtering operations, as well as de-heading and filleting 70 71 (Aadland, 2018; Asche, Cojocaru, & Roth, 2018; Bulio & Gierstad, 2013; Mikkelsen, 2017; Paluchowski, Misimi, Grimsmo, & Randeberg, 2016; Sandvold & Tveterås, 2014; Sund, 72 2016). Efforts of implementing machine learning in fish processes, such as segmentation of 73 fish and species identification (Hassanien, Tolba, Elhoseny, & Mostafa, 2018) are also a part 74 of the exertions to automate more of the fish processing industry. Despite this, the total 75 76 amount of industrial robots in the food industry reached 9700 units in 20017, less than 3% of 77 78 the total supply (International Federation of Robotics, 2018), and most are used for packaging/palletizing operations. The contemporary salmon industry has access to advanced equipment and systems for all stages within its value chain; however, the processing speed is 79 negatively affected by several manual interventions, such as cleaning, that continue to be 80 81 necessary (Asche et al., 2018). Furthermore, regarding the value chain of the fish, the automation of the open cleaning process has not yet been investigated; nevertheless, efforts 82 83 have been made in other cleaning aspects, such as the cleaning of tanks that are used in aquaculture (Mcrobbie & Shinn, 2011). Systems for Cleaning-In-Place (CIP-systems) are 84 85 common and well developed to clean pipes and other closed systems (Cramer, 2013).

86 Cleaning is the last process step during daily fish processing.

87

88 To cope with the risk of bacterial contamination, processing plants must be thoroughly and 89 frequently cleaned (Christi, 2014; Windsor & Tatterson, 2001); more specifically, salmon processing plants need to be cleaned daily. Cleaning is performed by cleaning crews after the 90 production has stopped; for several processing plants, this take place during the night owing 91 to double processing shifts. The cleaning costs up to EUR 1 million in labor per year for a 92 processing plant owing to high wages (including bonuses related to the poor working 93 conditions and working during the night). In addition, there are high expenses related to 94 chemicals and water. Moreover, the chemicals produce a spray cloud inside the processing 95 plants during cleaning, which pose health hazards to the cleaning personnel. A typical "spray 96

97 mist" can be seen in

98 Table 1 Comparison of the manual and robotic cleaning time in minutes

99 Figure 1. Furthermore, manual cleaning causes significant strain to the body from repetitive movements. The hoses that are used are heavy, and owing to high-pressure water, they are 100 difficult to handle. Cleaners may also be required to climb on equipment to reach inaccessible 101 areas. Overall, manual cleaning of fish processing plants requires considerable heavy lifting. 102 A robotic cleaning system could reduce the overall cost by reducing the cost of labor and by 103 potentially reducing the amount of chemicals and water used during cleaning. In addition, it 104 could improve the health, safety and environment (HSE) compliance for the workers by 105 reducing their exposure to the hazardous cleaning environment. Furthermore, a robotic 106 solution could stabilize the cleaning process as it would perform the task in the same manner 107 each time, thus removing the "human element," where different cleaners may perform the 108 tasks in a different manner. Finally, it is likely that a robotic cleaning system would perform 109 the task faster than manual cleaners. Robot technology in general, not just for cleaning, is 110 foreseen to play an important role in intelligent food manufacturing, replacing manual work 111 operations in several steps along the food processing chain (Khan, Khalid, & Iqbal, 2018). As 112 mentioned, robotic technology is implemented on some operations in the salmon industry, 113 114 however, cleaning of salmon processing plants are still subject to time consuming and costly manual labor (Løvdal, Giske, Bjørlykhaug, Eri, & Mork, 2017) and problems with bacteria do 115 116 occur.

117 Busby and Roberts (2009) estimated that the worldwide cost of all foodborne diseases was 118 \$1.4 trillion per year. L. monocytogenes is, next to Salmonella, by far the most frequently 119 reported pathogenic microorganism in the Rapid Alert System for Food and Feed; 120 notifications owing to this pathogen have increased in the EU since 2009 (European 121 Commission, 2015). The product categories that dominated the L. monocytogenes 122 notification reports were fish and fish products, often leading to trade embargoes of these 123 products (EFSA, 2013; Nielsen et al., 2017). Recalls, consumer complaints, and bad public 124 relations due to L. Monocytogenes contamination in commercial food products significantly 125 126 contributed to economic losses in the food industry. An illustrating example is the 2008 Canadian listeriosis outbreak linked to cold cuts from a Maple Leaf Foods (MLF) plant in 127 128 Toronto, Canada. Although MLF instituted a voluntary recall before the outbreak was linked to their plant, the outbreak cost the company in excess of \$50 million including market 129 losses, as well as lawsuits and compensations for victims and their relatives (Greenberg & 130 Elliott, 2009). Since 1999, the EU, Norway, Switzerland, Canada, Australia, and New Zealand 131 132 have all introduced a quantitative legal limit of 100 L. monocutogenes colony forming units (cfu) per gram, which is applied for a wide range of food products, including the most 133 susceptible ready-to-eat (RTE) products where L. monocytogenes is able to proliferate, such 134 as cold-smoked salmon products (Løvdal, 2015). USA has an even stricter legislation (i.e. 135 zero-tolerance) for RTE products resulting in an extremely high rate of recalls from the 136 market for potential listeriosis hazard (Goetz, 2013). Thus, measures to reduce the risk of 137 138 bacterial contamination in general, particularly contamination due to L. monocytogenes, are imperatively necessary and sought after by the salmon industry. To safeguard food safety, it 139 is crucial that the proposed robotic systems can perform equally well and, preferably, better 140 than the present manual cleaning practices. The objective of the present study is to first 141 develop and optimize, and then to evaluate the performance of a robot prototype in 142 comparison with a contemporary manual cleaning practice in a controlled set-up using 143 inoculation with relevant salmon spoilage bacteria that formed artificial biofilms. 144

145 **1.1** Future perspective

Robotic cleaning systems have already been well established in the literature. However, most
robotic cleaning systems were focused on the cleaning of flat surfaces, e.g., floors (Palleja,
Tresanchez, Teixido, & Palacin, 2010), walls (Lee et al., 2018), windows (Houxiang Zhang,
Jianwei Zhang, & Guanghua Zong, 2004), and solar panels (Jaradat et al., 2015). Cleaning

150 systems may be able to operate in large areas; nevertheless, they are limited to moving in two 151 dimensions, and they typically do not operate in 3D space. However, there are exceptions.

Cleaning systems, such as hull cleaning (Ortiz et al., 2007) and car/truck washers (Yu, 152 Kurnianggoro, & Jo, 2015), can operate in three dimensions and can clean objects of 153 arbitrary shape. However, to the knowledge of the present authors, there are no research 154 works in the literature focused on robotic cleaning for fish processing plants. Conventional 155 robotic manipulator designs do not fulfill the requirements of a robotic cleaning system for 156 fish processing plants (Bjørlykhaug, Giske, Løydal, Mork, & Egeland, 2017). Several aspects 157 of the robotic design deserve extra attention for a robotic cleaning system focused on fish 158 processing plants. Special consideration regarding the corrosion resistance, the intrinsic 159 contamination, and the transportation system, among others, must be considered to deliver a 160 satisfying operating performance. In addition, a robotic manipulator suitable for cleaning 161 fish processing plants should have a long reach (> 2 m); however, it would have a lower 162 payload requirement than typical industrial robotic manipulators. The robotic manipulator 163 itself must have long reach, be slender, have good dexterity, and provide adequate payload; 164 meanwhile, its weight should be as low as possible. Moreover, the footprint should be kept as 165 low as possible, and the system itself should be unintrusive because modern salmon 166 processing plants often have limited space available for such installations. Moreover, a 167 168 robotic cleaning solution should impose minimal contamination threats, thus adhering to hygienic design guidelines (EHEDG Secretariat, 2004; Giske, Mork, & Bjoerlykhaug, 2017), 169 to facilitate its efficient cleaning. 170

171

172 There is no existing literature that documents the effectiveness of robotic cleaning for fish

173 processing plants. Our novel contribution documents that such a system can deliver

satisfactory results, enabling this technology to be implemented in the industry. This work is

an extension of the work conducted in Bjørlykhaug et al. (2017).

176177 The remainder of the paper is organized as follows: First, the two robot systems are

presented in Section 2. The setups of the experiments are presented in Section 3. In Section

4, the results from the two different experiments are presented. Finally, in Section 5, the

180 present work is concluded, and further work is discussed.

181 2 ROBOTIC SYSTEM

182 Here, we will present the robotic system used in the experiments. The experiments were

183 conducted in two separate occasions, with two different robotic systems. The systems were

184 designed according to the challenges related to installing such a system in a real-world

185 processing plant. Examples of the equipment layout inside a plant are shown in Figure 2;

186 Figure 3 depicts typical installation locations for a future robotic cleaning system.

187 2.1 System 1

188 The first robotic system consisted of a conventional serial robot, namely the UR10, mounted 189 onto a vertical linear axis with a slewing ring, as shown in Figure 4. In addition, a 1 m long 190 lance holding the nozzle was mounted on the end effector. The combination of these factors

enabled the robot, which originally had a reach of 1300 mm, to cover a complete electric

stunner. This system was manually programmed "online", jogging the robot from point to point and creating a cleaning path. An overview of the architecture can be seen in

194 Bjørlykhaug et al. (2017).

195 2.1.1 Cleaning system

The cleaning system was composed of the industrial cleaning station 4K on wheels by System
 Cleaners. This equipment required 400 V AC and its input was regular pressure water. The
 output was high-pressure water or a mixture of air, chemicals, and water, used for spraying

foam. The end could hold different types of nozzles based on which mixture is sprayed. The

- end of the accompanying hose was attached to the UR10 robot in Experiment 1 and it was
- 201 used directly.

202 2.2 System 2

This system was an upgrade of System 1 and it was an effort to eliminate the drawbacks of System 1. Instead of a conventional robotic manipulator from a commercial supplier, a custom robotic manipulator tailored to the task was constructed, as can be seen in Figure 5. In addition, the robot was mounted on a custom horizontal linear axis suitable for

installation in the harsh environment of fish processing plants,

with the necessary hygienic considerations. The robot itself is a long-reach, slender robot,

- with a low payload capability (compared with typical industrial robots of the same reach),
- thereby maintaining the manipulator weight as low as possible. The robot and its kinematic
- chain are shown in Figure 6 and Figure 7, respectively. At full horizontal extension, the robot
 has a reach of 4 m; furthermore, its weight was approximately 220 kg.
- 212 ł 213

214 2.2.1 Cleaning system

The cleaning system of Experiment 2 was identical to the one in Experiment 1, except for the

fact that the hose was separated into six different hoses, each of which had their own solenoid valve that could be controlled to be switched on or off. Each of the six hoses continued up to

valve that could be controlled to be switched on or off. Each of the six hoses continued up to
the end-effector of the robot, where six identical nozzles were mounted at an angle with

- 218 the end-effector of the robot, where six identical nozzles were mounted at an angle with 219 respect to each other, as seen in Figure 8. For different parts of the cleaning procedure, a
- different number of nozzles was used. This eliminated the need for extra degrees of freedom
- (DOFs) close to the end-effector of the robot, thus removing the need for a servomotor near
- the end effector; this minimized the weight and made the robot slenderer.

223 2.2.2 Control system

One of the main limitations of System 1 was the manual programming of the robotic system. 224 This proved to be excessively time consuming and tedious; therefore, a better approach was 225 required, particularly considering that a potential industrialized version would be installed in 226 different plants, thus requiring different paths to be programmed. Offline programming of 227 228 the robot movements was decided to be the preferred approach. Because the robot was built anew, a control system had to be developed. For the control system, a distributed approach 229 230 was used. Instead of implementing the kinematics of the robot in the programmable logic 231 controllers (PLC), which controls the servos, a computer program calculated the actuator positions for the desired robot pose. A schematic detailing the control system approach is 232 shown in Figure 9. For a more thorough explanation of the trajectory generator, we refer to 233 Bjørlykhaug (2018). 234

235

236 2.2.3 Horizontal transportation system

The manipulator was mounted onto a horizontal linear axis to expand the work envelope of the robotic system. Similar to the manipulator, the linear axis was also built specifically for the task. Fish processing plants often have a processing layout that is not in a straight line. Unlike conventional linear axes, which are limited to a straight line of motion, this one has a modular design that was built from sheet metal building blocks, thus enabling curvature. With curvature, the axis was able to navigate the robot base in 2D, which potentially covered the complete processing plant depending on the particular plant layout.

244 3 METHOD AND TOOLS

Here, we will present how the experiments were set up for both cases. A physical experimentto measure the cleaning effect of robotic cleaning was the chosen method for both systems.

247 3.1 Experimental setups

248 3.1.1 Experiment 1

Regarding the methodology for Experiment 1, we refer to Bjørlykhaug et al. (2017). The robot in action during Experiment 1 is shown in Figure 10.

251 3.1.2 Experiment 2

Experiment 2 was set up as back-to-back experiments between cleaning by human operators 252 and cleaning by the robotic system. The equipment used to perform the cleaning test 253 consisted of an electric stunner and a conveyor used for gill cutting, both of which can be 254 typically found in fish processing plants. These machines are often considered among the 255 256 most important machines for cleaning, as they are situated immediately after the fish has been pumped into the processing facility. Typically, the machines are filled with fish residue, 257 fish protein, fish slime, and fish parts (of fins). Because this is where the gills are cut, blood is 258 usually spilled on a large part of these machines. The dimensions of the mini fish 259 slaughtering line cleaned in Experiment 2, as well as the sampling points for microbiological 260 analysis are shown in Figure 12. A length of almost 6 m and a width of a little over 1 m is close 261 262 to a typical installation at a fish processing facility.

263 3.1.3 Microbiology analysis

The electric stunner and conveyor were inoculated, as seen in Figure 11, with a bacterial 264 suspension cocktail of Pseudomonas fluorescens MF05002 (Trond Møretrø et al., 2016), 265 266 Pseudomonas putida ATCC 49128 from the American Type Culture Collection, and 267 Photobacterium phosphoreum CCUG 16288 from the Culture Collection University of Gothenburg. Bacteria cultivation, inoculation, and sampling were performed as previously 268 described (Bjørlykhaug et al., 2017), with only minor modifications. All bacteria were initially 269 grown separately to a stationary phase at 30 °C and 150 rpm in a shaking incubator in a 270 tryptic soy broth with 0.6% of yeast extract (TSBYE; Oxoid). Bacteria were pooled together at 271 272 250 mL of each strain in 1 L of sterile polyethylene bottles, which were then topped up with 250 mL of fresh TSBYE. The bacteria were maintained at ambient temperature (10-20 °C) 273 274 and were used within 72 h. The inoculation was performed by spraying the bacteria using a household spray flask on all open surfaces. Spraying was repeated once each hour four times. 275 Twenty-four hours after the first spraying, an incomplete biofilm had developed on the 276 surfaces (approximately 10⁶ cells cm⁻²). Prior to washing, eight predefined control points 277 278 were sampled using Sodibox cloths (Sodibox, La Fort-Fouesnant, France). After the manual washing procedure had been completed and the stunning machine had been air dried, an 279 additional eight predefined control points were sampled using Sodibox cloths (Figure 12). 280 281

The following day, the same routine was repeated for the robotic cleaning using bacterial 282 283 suspensions of the same age as for the manual cleaning. The samples were maintained at 4°C and were plated 48 h after sampling. Sodibox cloths were suspended in 100 mL buffered 284 peptone water (Oxoid) and were subject to homogenization using a stomacher machine 285 (Seward) for 2 min. Serial dilutions of the samples were spread-plated in triplicate on tryptic 286 287 soy agar with 0.6% of yeast extract (TSAYE; Oxoid); then, they were incubated at 30°C for 48 288 h before the bacterial concentrations were calculated as cfu per cm². The data are presented as logarithmic reductions in the plate counts (ΔN) between the counts before (N_o) and after 289 (N_r) cleaning, namely $\Delta N = \log N_r - \log N_o$. 290

291 **3.2** Cleaning procedures

A general cleaning process for fish processing plants is formulated in (Mariott & Gravani,2006):

- 294 1. Cover electrical equipment.
- 295 2. Remove large debris.

- 296 3. Remove soil deposits from the equipment, walls, and floors, proceeding from top to bottom towards the drains.
- 298 4. Disassemble equipment as required.
- 299 5. Pre-rinse the equipment with water at 40 °C or less.
- 300
 301
 6. Apply a cleaning compound effective against organic soil (typically an alkaline cleaner), with a temperature lower than 55 °C.
- 302 7. Wait for approximately 15 min to allow the cleaning compound to work.
- 303 8. Rinse the equipment with water at 55-60 °C.
- 304 9. Inspect equipment and the facility for effective cleaning.
- 305 10. Apply a sanitizer, typically a chlorine compound
- This procedure coincides with the cleaning procedures typical in Norwegian fish processing plants (Løvdal et al., 2017).
- 308 For our case, Steps 1, 2, 3, and 4 would not be necessary to be followed in any of the
- 309 experiments owing to the non-existence of fish debris and the absence of electrical
- 310 equipment. The test equipment was designed in such a way that the disassembly would not
- 311 be required prior to cleaning as part of the daily cleaning routine.
- 312 For the cleaning process in Experiment 1, please refer to Bjørlykhaug et al. (2017). The
- 313 cleaning process in Experiment 2 was performed as follows: the equipment was hosed down
- using cold high-pressure water at first. Immediately after hosing down all machines, a thick
- foam of *Lilleborg Enduro Super* with a diluted pH of 12,5 was sprayed on. This was allowed to stay on for 10 min before being washed off by using cold high-pressure water. Then, a foam
- to stay on for 10 min before being washed off by using cold high-pressure water. Then, a foam layer of *Lilleborg Titan 951*, a disinfectant of pH 7 (diluted), was sprayed on and was allowed
- to stay on for 10 min. Again, the equipment was washed down with cold high-pressure water.
- 319 This procedure was performed first manually by one cleaner, as seen in Figure 13; after the
- 320 equipment was inoculated with bacteria again, the robot system repeated the same cleaning
- 321 procedure. The cleaner performing the manual cleaning was employed at an undisclosed fish
- 322 processing plant as the team leader for all cleaners with 15 years of experience in cleaning
- fish processing plants. He performed the cleaning as he would have normally done.The robot was programmed offline in the simulation software, as shown in Figure 14. The
- 325 prototype in the test facility is shown in Figure 6.
- 326 Our cleaning procedure differs slightly from the general procedure detailed above. We
- followed the general recommendations of the professional cleaner who performed the
- manual cleaning, which is the industry standard. Moreover, we did not have access to hot
- 329 water at our test facility. However, it is common practice in the industry to use cold water.

330 4 RESULTS

We present the results from both experiments. The robot in Experiment 2 can be seen spraying water and soap in Figure 15 and Figure 17, respectively. In this study, the cleaning times for manual and robotic cleaning were not of primary importance; however, they are

334 listed in Table 1 for comparison.

335 4.1 Microbiology

The decrease in the bacteria count in Experiments 1 and 2 can be seen in Figure 16. The

decrease in bacteria after robotic cleaning in Experiment 1 (Figure 16A) was promising, and the bacteria count was between 10 and 100 cfu·cm⁻² for all control points, compared with 10^3 to 10^5 cfu·cm⁻² prior to cleaning.

- 340 In Experiment 2, the decrease in microbial count for both manual cleaning and robotic
- cleaning was substantial, as seen in Figure 16B. In this trial, the inoculated bacterial load was
- 342 higher than that in Experiment 1, *i.e.*, between 10^5 and 10^7 cfu cm⁻². This difference is

- presumably attributed to the significantly higher temperatures (~20 °C) of growth compared 343 with the ones in Experiment 1 (~5 °C), combined with a slightly extended time between the 344 inoculation and the cleaning. In Experiment 2, the bacterial load after both manual and 345 robotic cleaning was between 1 and 200 cfu·cm⁻². Although the data were too sparse for us to 346 perform a statistical comparative analysis, it is clear that the robot performed the cleaning at 347
- least as well as or better than the operator in this particular case (Figure 16B). 348

DISCUSSION 5 349

A main limitation of this work is that only one instance of both experiments was performed. 350 Performing additional repetitions of the same experiments would result in a more reliable 351 measurement of the effectiveness. Additionally, these experiments were performed in a 352 closed scenario. Testing in a real-world processing plant might have affected the results in a 353 certain manner. However, Experiment 2 was performed at a technology readiness level (TRL) 354 of 5-6 (Horizon 2020 Work Programme Commission, 2014), and clearly illustrated the 355 validity of robotic cleaning. The spraved bacteria produced a biofilm that is close to the real 356 biofilm often found in fish processing facilities; the experiments showed that the robot was 357 fully capable of washing the biofilm away, thus inhibiting the establishment of niches known 358 to facilitate growth of spoilage bacteria and human pathogenic bacteria, such as the. L. 359 monocytogenes (T. Møretrø & Langsrud, 2004). 360

361

An even more industrialized version of the robot is required in the future and tests in a real-362 world fish processing plant is the only manner to validate if the robot can perform as well or 363 better than a manual cleaner. Furthermore, it would be beneficial to combine the robot 364 solution with a vision system to detect blood or microorganisms; these would eliminate the 365 need for manual control after cleaning. 366

367

It is probable that the optimization of the robot program related to information collected 368 from several trials, both in the laboratory and in real life, in a fish-processing factory will 369

- further improve the cleaning results, particularly in corners and places of limited 370 accessibility. 371
- 372
 - Corners and spaces of limited robot accessibility can be evaluated for a redesign, layout altering, or a more hygienic design as well (Giske et al., 2017). Robot cleaning can be 373
 - considered as a method to standardize the cleaning process compared with human operators, 374
 - as the robot will perform the task equally well on each instance. The standardization of the 375
 - cleaning process will also stabilize the method, which is one of the core principles in lean 376
 - manufacturing (Liker & Meier, 2005), thus enabling a more predictable performance of the 377
 - 378 cleaning process, which can be used in further efforts to further stabilize the fish processing in general. This will allow for incremental improvements from several aspects; the robot 379
 - operation itself, the design of the equipment, and even the type of materials (stainless steel, 380 plastic, etc.) can be adapted for optimal cleaning processes. In addition, high-temperature 381 382 steam or new chemicals that may not be allowed or are suitable to be currently used owing to
- 383 the HSE requirements or considerations, may now be possible to be used.
- 384

385 Furthermore, the robotic system can store the cleaning operation in an electronic format and offer it as proof of the cleaning quality to the customers, thus substantiating that their fish 386 products are produced in an environment that does not compromise quality. Fish processing 387 388 companies claim that this is key in competing in the global seafood market.

- The robot performed the cleaning at a relatively slow, steady pace during Experiment 2. The 389
- speed was limited owing to vibrations in the system, which became great if the speed was 390
- increased. In this research, only the cleaning results were the focus, and not the cleaning 391
- speed. In the next version, the robot design will be upgraded so that the robot may achieve 392
- higher speeds and accelerations; and it is still believed that a robotic solution will perform the 393
- cleaning tasks faster than manual cleaning operations. Furthermore, it is also possible to use 394 several robots to clean different areas. When cleaning a large area, the waiting time may be 395

- 396 neglected because the robot can rinse the first part of the area immediately after the
- application of the chemicals on the last part of the area.
- 398

In addition, robotic cleaning of fish processing plants may reduce cleaning costs. A manual

400 cleaner in Norway earns EUR 60-70k per year; the suggested solution could easily replace

401 several cleaners. In a robotic cleaning concept, one could possibly even allow increased

402 cleaning time as the main cost, whereas manual work hours would be reduced. Even further403 savings are predicted when tuning the robot to use exactly the amount of water and chemicals

savings are predicted when tuning the robot to use exactly the amount of water and chemicalsthat are needed for the task, instead of consuming random amounts used in modern manual

405 cleaning processes.

406 6 CONCLUSION AND FUTURE WORK

407 It can be concluded that although the robot system has its limitations in its current form, a

robotic cleaning system can perform the cleaning as well as or better than manual cleaning.

409 Additionally, the repeatability of a robotic system compared with human operators will

410 potentially ensure better hygiene and control of bacteria that develop in fish processing

411 plants over time.

412 6.1 Future work

Future work related to robotic cleaning will need to focus on installing a robotic cleaning 413 system in a producing fish processing plant. This will enable long-term measurements of the 414 effectiveness of robotic cleaning at a higher TRL. There are still certain challenges that have 415 416 not been addressed by the experiments conducted in this study, including the fact that in real-life processing plants, certain fish remains are likely to be present on the equipment. 417 This is because the robot only performs a predefined cleaning path and does not consider 418 how to identify and hose away the remains as a manual cleaner would do. The robotic 419 cleaning system must be expanded into including vision and algorithms for the detection of 420 fish remains, as well as be taught how to hose away such residue for it to fully replace manual 421 cleaners. The possibility to develop a vision system to detect blood and biofilm should be 422 investigated, as well as its use for the programming of the robot, and possibly for measuring 423 cleaning results. Machine learning and simulation could also be used to enable the robot to 424 program itself, and to use cleaning results to optimize the cleaning path. 425

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 fluorescens MF05002 strain.
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- 556 Table 1 Comparison of the manual and robotic cleaning time in minutes
- 557 Figure 1 The environment in which a robotic cleaning system will operate
- 558 Figure 2 Slaughtering line at facility 1
- 559 Figure 3 Slaughtering line at facility 2
- 560 Figure 4 A CAD model of the linear axis and the rotational axis assembly. A support frame was manufactured to 561 suspend the assembly from the ceiling
- 562 Figure 5 A CAD model of robot 2, mounted on the horizontal linear axis
- 563 Figure 6 Robotic system 2 in the test facility
- 564 Figure 7 Kinematic chain of the custom robot in prototype 2
- 565 Figure 8 Nozzle arrangement
- 566 Figure 9 Overview of the control system
- 567 Figure 10 Prototype 1 during Experiment 1
- 568 Figure 11 Spraying of the inoculation mixture in Experiment 2
- Figure 12 Control points and dimensions of equipment in Experiment 2. The electric stunner in the cleaning
 position with the conveyor belt connected at the front. Sampling points for microbiological analysis in
 Experiment 2 are indicated as follows: S1 and S2 are steel lamellae on the electrical stunner; P1 and P2 are
 plastic walls inside the electrical stunner; S3 and S4 are steel cross-beams under the belt of the conveyor and
 the stunner, respectively. P3 and P4 are the inside plastic walls on the conveyor and the stunner, respectively.
 (Care was taken not to sample the same areas before and after cleaning)
- 575 Figure 13 Manual cleaning in Experiment 2
- 576 *Figure 14 Simulation of the cleaning process*
- 577 Figure 15 Prototype 2 spraying water

578Figure 16 Bacterial log reduction as an effect of robotic cleaning in Experiment 1 (A) and as an effect of manual579and robotic cleaning in Experiment 2 (B). S=Steel and P=Plastic. For sampling points in (B), see Figure 12. Data580in (A) are redrawn from Bjørlykhaug et al. (2017). Error bars represents standard deviation (SD) of n=3581triplicate plates per sample with error in log Nx and log No propagated ((SD log Nx2+SD log No2)^{1/2})

582 Figure 17 Prototype 2 spraying soap

Highlights: Experimental study of effectiveness of robotic cleaning for fish processing plants

The cleaning of fish processing plants is in large part a costly operation which is unstable in terms of outcome.

Two cleaning experiments in which a robot is used to do cleaning of bacteria inoculated fish processing equipment is done.

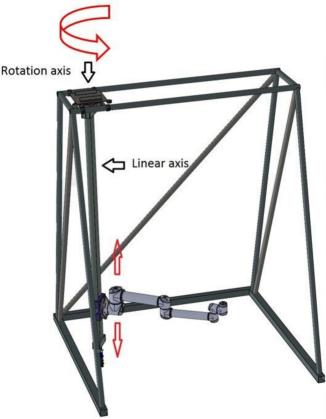
Both experiments show very promising results after testing, indicating that robots could clean fish processing plants.

Robotic cleaning of fish processing plants could enable more stable cleaning results and mitigate bacterial contamination.

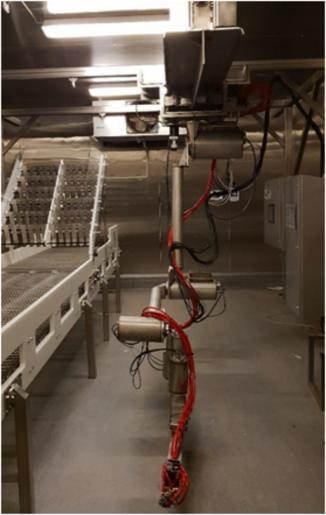


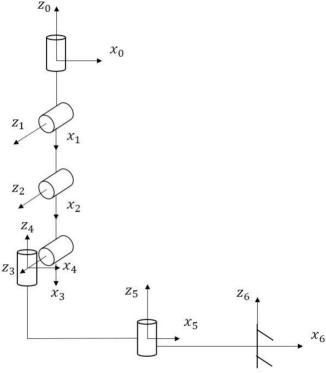














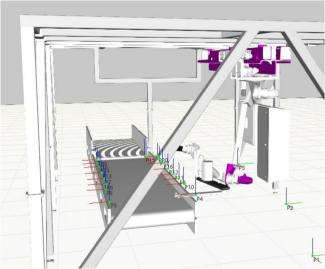




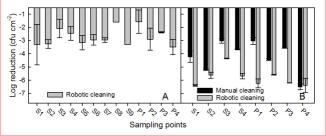














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Cleaning procedure	Rinsing	Foam soap	Rinsing	Foam disinfectant	Rinsing	Total time
Manual time	6	2	10	1,5	5,5	45*
Robotic time	33	33	33	33	33	185*

Table 1 Comparison of manual and robotic cleaning time in minutes

*Included in the total time is 2 x 10 minutes of waiting time between applying foam and rinsing to allow the chemicals to work