

# Investigating Fish Contamination Scenario and Community Willingness to Adopt Consumption Advice Proposing an Advisory Model

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## Research Article

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1 **Investigating fish contamination scenario and community willingness to adopt consumption advice**  
2 **proposing an advisory model**  
3

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21 **Abstract:** Consumption advice to ensure the health and safety of fish consumers remains urgent to handle the  
22 ever-increasing panic over heavy metal toxicity. Moreover, studies of fish consumption rarely focus on the  
23 perceptions and awareness of consumers. Considering this, the present study examines the knowledge and  
24 perceptions of the risks and benefits of fish consumption among consumers of Laguna de Bay to explore their  
25 willingness to follow fish consumption advice. The seasonal variation in selected types of heavy metal  
26 contamination in two commercially important fish species, tilapia and mudfish, was analysed and a  
27 vulnerability map based on the risk–benefit ratio was produced for Laguna de Bay. Furthermore, this study  
28 formulates fish consumption advice for consumers of fish in the area. Primary data on consumers’ perceptions  
29 were collected through a questionnaire, whereas heavy metal contamination data were compiled from the best  
30 available literature. We concluded that people’s willingness to adopt consumption advice is mostly dependent  
31 on their existing level of fish consumption. Moreover, consumption advice is formulated to indicate  
32 restrictions on consumption for the areas identified as vulnerable due to contamination. This empirical study  
33 can serve as a model for the future development of fish consumption advice in the region.

34 **Keywords:** Heavy metals, environmental pollution, risk–benefit ratio, vulnerability, health risk.  
35

36 **Declarations**

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46 Authors' contributions:

47 Lubna Aalam: Conceptualization, formal analysis, writing-original draft and funding acquisition.

48 U Rashid Sumaila: Validation and reviewing the draft;

49 Md Azizul Bari: Investigation, data curation, and statistical analysis.

50 Ibnu Rusydy: GIS Software and visualization.  
51 Mohamed Saiyad Musthafa: Review and editing.  
52 Mazlin Mokhtar: resources and project administration.

53

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56

## 57 **1. Introduction**

58 Fish are considered an important source of essential proteins, lipids, vitamins, minerals and unsaturated  
59 fatty acids, such as Omega-3 (Mohanty et al. 2019; Nordhagen et al. 2020; Balami et al. 2019). Therefore, fish  
60 consumption is highly recommended by nutrition experts worldwide, assuming a positive effect on the health  
61 of consumers. However, fish can pose a health risk due to contamination, especially by heavy metals (Costa et  
62 al. 2020; Alam and Mohamed 2011; Kim et al. 2020), which are well-known environmental pollutants because  
63 of their toxicity, persistence in the environment, and bioaccumulative nature (Ali et al. 2019). Several natural  
64 and anthropogenic processes, including volcanic eruptions, spring water, erosion, bacterial activity, fossil fuel  
65 combustion, industrial processes and agricultural activities, distribute heavy metals in the environment (Florea  
66 et al. 2004). Therefore, the contamination of aquatic systems with heavy metals has become a matter of concern  
67 over the last few decades (Canli et al. 1998; Javed and Usmani 2011; Hong et al. 2020). Exposure to heavy  
68 metals is known to cause adverse effects on human health, with an increased probability of respiratory problems,  
69 kidney pathology, neurological disorders and cancers (Mohammadi et al. 2019; Sall et al. 2020). Thus,  
70 consumer concerns have recently focused on the risk–benefit ratio of consuming fish and the safe consumption  
71 level. The risks and benefits of fish have been mentioned in the media and the literature (Alam et al. 2015a;  
72 Ricketts et al. 2019; Laird et al. 2018; Haque et al. 2019); however, much less attention has been devoted to  
73 safe consumption limits. Uncertainty remains regarding the level of risk and circumstantial factors that may  
74 impact consumers' health. At the same time, perceived public risks need to be acknowledged by policymakers  
75 to manage food safety risks; thus, many studies have been focused on informing and educating consumers about  
76 food safety (Rahmaniya and Sekharan 2018; Ahmed et al. 2020 b).

77 The Philippines has an enormous water area, encompassing about three-quarters of the country's  
78 geography, accelerating Filipinos' dependency on fish for their animal protein demand. The average per capita  
79 fish consumption of 41 kg in the Philippines is one of the highest in Southeast Asia and is considered  
80 comparatively high by world standards (Ahmad et al. 2003). As a result, the Philippines remains one of the top  
81 fish-producing countries in the world and over 1.6 million Filipinos depend on the fishing industry for their  
82 livelihood (WCPFC 2016). Laguna de Bay, which is the largest inland water body in the Philippines, contributes  
83 greatly to meeting the fish demand, producing about 80,000–90, 000 metric tons of fish in a year through  
84 aquaculture and open-water fisheries (LLDA 2020). However, Laguna de Bay's fisheries have been affected by  
85 human, industrial and environmental factors, threatening the fisheries' resources due to contamination  
86 (Tamayo-Zafaralla et al. 2002; Hallare et al. 2005). However, few studies have concentrated on the  
87 contamination of fish from Laguna de Bay (Molina 2012; Molina et al. 2011). Most studies failed to integrate  
88 evidence of contamination and consumers' perceptions to guide research on decision-making for the  
89 development of fish consumption advice. Many developed countries respond to the potential risk of  
90 contaminants in fish by issuing advice, but no proper initiatives have been undertaken to protect the consumers  
91 of the developing world. As a result, consumers are not well informed and are unable to make good decisions  
92 with regard to their fish consumption.

93 Therefore, in this study, the knowledge and perceptions of consumers of fish in the Laguna Lake area of  
94 the Philippines were examined to understand people's willingness to adopt fish consumption advice. The study  
95 also explored the contamination scenario of two commercially important fish species, tilapia (*Oreochromis*  
96 *niloticus*) and mudfish (*Ophicephalus striatus*), collected from Laguna Lake, conducting a risk–benefit analysis  
97 and producing a vulnerability map. Furthermore, safe consumption guidelines have been formulated for both  
98 species, which can serve as a model for future fish consumption advice in the region.

100 **2. Materials and Methods**

101 *2.1. Data collection*

102 This research used a self-administered survey questionnaire to collect primary data on the fish  
 103 consumption of consumers in the Laguna de Bay area. The study area is located at the municipality of Los  
 104 Baños in the province of Laguna, Philippines. Los Baños is politically subdivided into 14 barangays (villages).  
 105 Of these 14 villages using random sampling method three nearest villages of University of the Philippines Los  
 106 Baños have been selected for this study namely, Batong Malake, Anos and Tuntungin-Putho. A total 100  
 107 respondents participated in the survey and the sample size was calculated according to the following equation  
 108 based on Bari (2015),  
 109

110 
$$n = \frac{N_o}{1 + N_o/N} \dots \dots \dots (1)$$

111 
$$N_o = t^2(p)(1 - p)/d^2 \dots \dots \dots (2)$$

112 Where, n is the sample size, N is the size of the population, No is the sample size of a defined population,  
 113 d is the error term that is estimated at 5%, p is the estimated frequency of the sample with size n, while t is the  
 114 figure obtained from the t-student's table. With a 95% confidence level, the overall sample size was calculated  
 115 to be 90 participants, with an additional 10 individuals questioned to rule out anomalous values.  
 116

117 The survey aimed to assess consumers' perceptions of fish consumption through open-ended questions on  
 118 topics such as the risks and benefits of eating fish; their knowledge of fish contamination and water pollution;  
 119 their fish consumption rate; the quality of fish; information needed for safe consumption, etc. Moreover,  
 120 demographic information (age, occupation, education level, income, household size and number of children)  
 121 was collected during the survey.  
 122

123 The information on heavy metal contamination in fish utilised in the study was based on the best available  
 124 dataset in the literature for Laguna Lake (Molina 2012; Molina et al. 2011). Two popular and commercially  
 125 important fish species, tilapia (*Oreochromis niloticus*) and mudfish (*Ophicephalus striatus*), were considered  
 126 in the study for formulating consumption advice. The dataset comprises seasonal data on fish contamination  
 127 collected from eight different locations within Laguna Lake.  
 128

129 *2.2. Data Analysis*

130 Nonparametric factor analysis, along with the multiple regression model, were performed using a  
 131 statistical analysis system (SPSS) to explore consumers' perceptions of fish consumption and willingness to  
 132 adopt consumption advice. Variance in the willingness to adopt fish consumption guidelines was regressed  
 133 against the 12 independent variables, following the below equation:  
 134

135 
$$y_i = \beta_0 + \beta_1x_{1i} + \beta_2x_{2i} + \beta_3x_{3i} + \beta_4x_{4i} + \beta_5x_{5i} + \beta_6x_{6i} + \beta_7x_{7i} + \beta_8x_{8i} + \beta_9x_{9i} + \beta_{10}x_{10i} +$$
  
 136 
$$\beta_{11}x_{11i} + \beta_{12}x_{12i} + e_i, \quad (3)$$

137 where:

- 139  $y_i$  = Response variable (willingness to adopt consumption advice)
- 140  $\beta_0$  = Constant variable
- 141  $\beta_1$  = Coefficient of first control variable,  $x_{1i}$
- 142  $\beta_2$  = Coefficient of second control variable,  $x_{2i}$
- 143  $\beta_3$  = Coefficient of third control variable,  $x_{3i}$
- 144  $\beta_4$  = Coefficient of forth control variable,  $x_{4i}$
- 145  $\beta_5$  = Coefficient of fifth control variable,  $x_{5i}$
- 146  $\beta_6$  = Coefficient of sixth control variable,  $x_{6i}$

147  $x_{1i}$  = Controlled variable (fish consumption)  
 148  $x_{2i}$  = Controlled variable (age)  
 149  $x_{3i}$  = Controlled variable (occupation)  
 150  $x_{4i}$  = Controlled variable (education)  
 151  $x_{5i}$  = Controlled variable (income)  
 152  $x_{6i}$  = Controlled variable (number of children)  
 153  $x_{7i}$  = Controlled variable (risks of consuming fish)  
 154  $x_{8i}$  = Controlled variable (benefits of consuming fish)  
 155  $x_{9i}$  = Controlled variable (contamination in fish)  
 156  $x_{10i}$  = Controlled variable (water pollution)  
 157  $x_{11i}$  = Controlled variable (availability of information)  
 158  $x_{12i}$  = Controlled variable (confusion about fish quality)  
 159  $e_i$  = Error

160

161 The scenario of contamination in targeted fish species was analysed through seasonal variations, a risk–  
 162 benefit assessment and a vulnerability map. The data were inputted into Microsoft Excel, including the  
 163 coordinates (longitude and latitude) and the vulnerability data (risk–benefit ratio). Following this stage, ArcGIS  
 164 software developed by ESRI was utilised to plot eight locations of vulnerability data into the map. The data  
 165 were imported into ArcGIS and the coordinate system used in ArcGIS was set accordingly. For this research,  
 166 we applied the geography coordinate system (GCS) and WGS (World Geodetic System) 84 as the datum  
 167 reference. All data were represented in circles. The size of the circles illustrates the level of vulnerability, as  
 168 shown in the map legend; the digital elevation dataset was taken from NASA (2017).

169

170 The formulation of consumption advice was carried out through the estimation of the safe dietary intake  
 171 (CRL<sub>im</sub>) and maximum allowable fish consumption rate (CR<sub>mm</sub>), using the below equations (Gbogbo et al.  
 172 2018; Shakeri et al. 2015):

173

$$174 \quad CR_{im} = (RFD \times BW)/MC \quad \dots(4)$$

175 where:

176 CR<sub>im</sub> is the maximum amount of fish consumption in terms of the limiting consumption rate (kg/day).

177 Rfd = Oral reference dose (mg/kg) based on USEPA summary table (USEPA 2011).

178 Bw = Body weight (65 kg for adult and 35 kg for child).

179 MC = concentration of metal (mg/kg).

180 The number of acceptable fish meals per month (CR<sub>mm</sub>), is calculated according to the formula below:

$$181 \quad CR_{mm} = (CR_{im} \times Tap)/MS \dots\dots(5)$$

182

183 Tap is the time average period (365.25 days/12 months = 30.44 days per month) and MS is the meal size  
 184 (0.227 kg fish/meal for adults and 0.085 kg fish/meal for children under six years old). An advisory table was  
 185 produced following the style of the Maryland Fish Consumption Advisories (MDE 2020).

186

### 187 3. Results

#### 188 3.1. Community willingness to adopt consumption advice

189 The survey consisted of 72.2% of male and 27.8% of female respondents. The majority of the respondents  
 190 were between 21 and 30 years old. Most respondents had higher levels of education (college/university).  
 191 However, about 26% of participants had an education below secondary level. In terms of occupation,  
 192 government/nongovernment workers comprised the highest proportion in terms of profession, comprising  
 193 35.6% of the total respondents; 24.4% were students, 23.3% were fishermen/farmers, and 16.7% were  
 194 businessmen. In terms of income distribution, this study found that 43.3% of the respondents were middle-  
 195 income individuals, followed by upper-middle (28.9%), lower (24.4%) and higher-income (3.3%) participants.

196 A factor analysis was carried out to reduce the large number of surveyed socioeconomic variables into  
 197 fewer factors, extracting the maximum common variance from all variables and merging them into a common  
 198 score that will be used for further analysis of multiple regressions. Table 1 demonstrates that, out of 15 variables,

199 three variables were eliminated, leaving 12 variables that were distributed according to six components. All six  
200 components were later named as particular factors, such as social status, fish consumption behaviour, trust on  
201 fish quality, economic dependency, worry and risk.

202 In the attribute “sociodemographic”, four items were identified: age, occupation, education and number of  
203 children. Factor 2 shows that all the variables were directly related to the consumption behaviour of participants,  
204 including the amount of fish consumption, participants’ concern about contamination in the fish they eat, and  
205 intention to acquire information on the risks and benefits of consuming fish. Since the variables in factor 3  
206 clearly describe the trust of the consumer in terms of the benefits of consuming fish and their confusion about  
207 the quality of the fish they consume, this factor was called “trust”. Factor 4 represents variables related to  
208 economic dependency, namely the occupation and income of participants, whereas the fifth factor extracted  
209 information on worry, including the variables fish consumption benefit and water pollution. The last factor  
210 explained people’s concerns about the risks of consuming fish.

211 A multiple linear regression analysis was used to predict the factors influencing consumers’ willingness  
212 to adopt fish consumption guidelines as a health management measure in the Laguna de Bay area. Consumers’  
213 willingness to adopt fish consumption advice was the dependent variable, while the independent variables  
214 extracted from the factor analysis included sociodemographic factors (age, occupation, education and number  
215 of children), fish consumption behaviour (level of fish consumption, perceptions about fish contamination and  
216 availability of received information), perceived benefit (perceptions of the benefits of fish consumption and  
217 confusion about the quality of fish), economic dependency (occupation and income), worry (perceived benefits  
218 of fish consumption and perceptions of water pollution) and risk (perceived risks of fish consumption).  
219 Multivariate findings indicated that the level of fish consumption was the best predictor of consumers’  
220 willingness to adopt the consumption guidelines ( $P = 0.000$ ), followed by respondents’ perceived knowledge  
221 about fish contamination ( $P = 0.003$ ) and respondents’ self-reported age ( $P = 0.044$ ), as presented in Table 2.

### 222 3.2. Seasonal variation of heavy metal contamination

223 For the statistical analysis, an independent sample t-test was applied to explore the statistical difference in  
224 heavy metal contents in fish samples collected during the dry and wet seasons. The null hypothesis ( $H_0$ ) and  
225 alternative hypothesis ( $H_1$ ) of the independent sample t-test are as follows:

226  $H_0: \mu_1 - \mu_2 = 0$  (“the difference of the means is equal to zero”)

227  $H_1: \mu_1 - \mu_2 \neq 0$  (“the difference of the means is not equal to zero”),

228 where  $\mu_1$  and  $\mu_2$  are the population means for the dry and wet seasons, respectively.

229 Table 3 displays the results of the independent sample t-test, indicating the equality of means. In the case  
230 of arsenic (As), since  $p < 0.0001$ , we can reject the null hypothesis and conclude that the mean concentration  
231 of As during dry and wet season is significantly different ( $t_{15.75} = 3.72$ ,  $p < 0.001$ ). However, the null  
232 hypothesis was accepted for the rest of the heavy metals, finding no significant difference in the mean  
233 concentration in fish between the dry and wet seasons.

234

### 235 3.3. Risk–benefit assessment

236 The present study aims to estimate the risk–benefit ratio of consuming tilapia and mudfish from Laguna  
237 Lake, the Philippines, following the method presented by Gladyshev et al. (2009). It is well known that taking  
238 1000 mg of EPA + DHA, which is prescribed by many organisations such as the World Health Organisation,  
239 the British Nutrition Foundation and the American Heart Association, is beneficial for maintaining good health  
240 by preventing mental, neural and cardiovascular diseases. A health benefit assessment was carried out,  
241 considering this recommended amount of EPA + DHA (EFA) in the human diet, using the below formula:

$$242 \quad FP = \frac{Refa}{c} \dots\dots (6)$$

243 where:

244 Refa = the recommended dose of EFA for a person (mg/day).

245 FP = portion of fish one has to consume to obtain the recommended Refa (g/day)

246 C = content of EFA (EPA+DHA) in the target fish (mg/g).

247 In the current study, the EFA value of tilapia was 1.03 mg/g (Al-Souti and Claereboudt 2014) and, for  
248 mudfish, it was 0.5 mg/g (Muhamad and Mohamad 2012). Through consumption of the recommended amount  
249 of EFA, the consumer can also ingest a significant amount of the contaminant through the fish; this amount can  
250 be calculated using the formula below:

$$251 \quad DM = FP \times CM \dots\dots (7)$$

252 where: CM = the contamination in fish ( $\mu\text{g/g}$ ).

253 The following equation was utilized to measure the risk of consuming the dose of heavy metal:

$$254 \quad HQ = \frac{DM}{RfD \times AW} \dots\dots (8)$$

255 where:

256 HQ = Hazard quotient (HQ < 1, indicates no possible risk)

257 RfD = maximum tolerable daily intake of a specific metal ( $\mu\text{g/kg/day}$ ). RfD for As = 0.3, Pb = 0.003, Cd  
258 = 0.001, Cr = 0.003, Hg = 0.1. (Alam et al. 2015b; USEPA 2011).

259 AW = average adult weight (65 kg)

260 A hazard quotient (risk–benefit ratio) for fish consumption (HQ<sub>efa</sub>) was calculated for consuming the  
261 portion of fish to achieve the recommended amount of EFA, estimated using the following equation:

$$262 \quad HQ_{efa} = \frac{Ref_a \times CM}{C \times RfD \times AW} \dots\dots (9)$$

263 From the calculated risk–benefit ratio, it was found that HQ<sub>efa</sub> was an order of magnitude higher among  
264 the samples of mudfish compared to the tilapia (Table 4). The HQ<sub>efa</sub> values for mudfish ranged between 0.05  
265 and 28.28, while the HQ<sub>efa</sub> for tilapia was in the range of 0.04 to 16.02.

266

### 267 3.4. Vulnerability map

268 Cluster analysis is a statistical technique used to identify homogenous groups or clusters of similar sites  
269 based on similarities within a class and dissimilarities between different classes (Kannel et al. 2007). In this  
270 study, a hierarchical cluster analysis (HCA) was performed based on the calculated risk–benefit ratio to identify  
271 different groups in Laguna Lake by the location where the fish samples were collected. The result of this  
272 analysis is shown as a dendrogram (Figure 1), where the horizontal axis represents the distance or dissimilarity  
273 between clusters and the vertical axis represents the objects and clusters. The HCA conducted in this study  
274 explored three clusters, indicating high-, medium- and low-vulnerability zones. The first cluster comprised  
275 locations 1A and 1B (high), while the second cluster constituted 2A, 3A and 3B (medium). In the third cluster,  
276 locations 2B, 4 and 5 were linked with one another as low-vulnerability zones.

277 It is well known that vulnerability mapping helps to target vulnerable hotspots and recommend appropriate  
278 interventions (Gizachew and Shimelis 2014). Considering this, a vulnerability map of Laguna Lake was  
279 produced based on the risk–benefit ratio of contamination in fish (Figure 2). The vulnerability map clearly  
280 identified Binangonan and Taguig of the northern West Bay (1A and 1B) as the most vulnerable areas of Laguna  
281 Lake, signifying the necessity of further detailed research and risk assessments, as well as management.

282

### 283 3.5. Formulating fish consumption advice

284 In this study, we assessed the maximum number of servings of tilapia and mudfish from Laguna Lake that  
285 can be safely consumed over a month. Tables 5 and Table 6 show the maximum number of times the fish can  
286 be safely eaten in a month if the average meal contains 0.227 kg of fish for an adult and 0.085 kg of fish for a  
287 child (below six years) and a woman of childbearing age. Red indicates a “risk”, where restrictions on  
288 consumption have been set. On the other hand, yellow reflects “moderate restrictions” and green is “no  
289 restrictions”. Considering the safe consumption of more than 16 meals per month (USEPA 2000), in this study,

290 the consumption advice was designed according to the CRmm values, with  $\leq 10$  as risk; 11 to 16 as moderate  
291 restriction and  $> 16$  as no restrictions.

292 For tilapia, the lowest consumption limit was for the areas of the central West Bay and central bay at three  
293 meals per month for adults due to the As contamination during the dry season. Similarly, the lowest  
294 consumption limit was advised for children and women of childbearing age in the central West Bay. In general,  
295 As and Pb were found to be the elements responsible for the consumption restrictions on tilapia collected from  
296 different areas of Laguna Lake. However, no restrictions were set for the consumption of tilapia on Talim Island  
297 in the central West Bay and Cardona in the central bay. On the contrary, northern West Bay areas were identified  
298 as moderate-risk areas for tilapia consumption. Similar to tilapia, for mudfish, the areas with a high-risk  
299 advisory were identified as the northern West Bay and central bay, with a consumption limit of five meals in a  
300 month because of the considerable contamination with Hg. In general, the most important elements influencing  
301 the consumption advice for mudfish were Hg, As and Pb. However, the east bay, south bay and West Bay were  
302 denoted as comparatively safe zones for mudfish consumption, with moderate or no restrictions.

303

#### 304 **4. Discussion**

305 The goal of this study was to evaluate the acceptability of consumption advice among fish consumers of  
306 the Laguna de Bay area and propose advice as a model for future development. The findings of the factor  
307 analysis, based on the community survey, revealed that factor 1 consists of four items linked with the  
308 sociodemographic data of consumers, which is similar to the previous study conducted by (Samoggia and  
309 Castellini 2018), reflecting the social influences on participants' fish consumption. Given the characteristics of  
310 the respondents in factor 2, it is likely that they are interested in having full information about fish contamination  
311 and the risks and benefits of the fish they consume, as the level of fish consumption is the most significant  
312 indicator of this factor. Conversely, respondents in factor 3 with a better perception of the benefits of fish  
313 consumption had a negative perception of fish quality, which implies that people who think fish consumption  
314 is beneficial are not confused about the quality of the fish they consume. It is assumed that the food preferences  
315 of a family can be influenced by family members' decisions to consume fish, as well as the frequency and the  
316 type of fish eaten (Myrland et al. 2000; Trondsen et al. 2004). The present study also extracted the number of  
317 children in the consumer's family as an important item of factor 1. The influence of children on food choices is  
318 not a new phenomenon, as studies from the last two decades also suggested that having children at home is the  
319 most significant factor in changing one's food consumption patterns (Reilly 1999; Tucker et al. 2006).  
320 Consumers with children in their household were more likely to seek out food safety information as well as to  
321 intend to increase their knowledge of food safety issues (Bennett 1999; Tucker et al. 2006). Another study  
322 reported that respondents with children had a significantly higher frequency of fish consumption and belief in  
323 the health benefits of fish consumption compared with families without children (Verbeke et al. 2005).  
324 However, a slightly unexpected finding was observed in another study (Tucker et al. 2006), in which  
325 respondents with children in their household perceived lower levels of risk than respondents with no children.

326 Education plays a major role in consuming fish because it positively impacts the belief that fish is  
327 important for health and influences the fish consumption frequency. This opinion has also been addressed by a  
328 previous study (Myrland et al. 2000). On the other hand, some studies confirmed that there was no difference  
329 in fish consumption based on educational status, and highly educated consumers thought of fish as a "difficult-  
330 to-prepare" food (Myrland et al. 2000; Danso et al. 2017). Furthermore, income can influence healthy eating  
331 practices and has an impact on fish consumption. Thus, the factor analysis in the present study also identified  
332 income as an important factor, with a loading value of 0.647. Previous studies reported that consumers with a  
333 high level of education and high income consume healthier food (Skuland 2015), and a positive relationship  
334 exists between fish consumption and income levels (Skuland 2015; Myrland et al. 2000; Trondsen et al. 2004).  
335 Likewise, the high price of fish is considered one of the most common perceived barriers to fish consumption,  
336 as fish is considered more expensive than other protein sources. A tendency toward a lower frequency of fish  
337 consumption was found for respondents with the lowest income levels in comparison with other income groups  
338 for consumers in Belgium (Verbeke et al. 2005).

339 Employing a multiple linear regression method to predict the willingness to adopt consumption guidelines  
340 was a good choice, as this method is widely used for similar kinds of predictions (F. Zhang and Li 2019). The

341 main predictors of willingness were linked with the factor class of consumers' behaviour, such as the level of  
342 fish consumption, perceptions of fish contamination and the availability of information related to fish  
343 consumption. This clearly implies that consumers with a higher level of fish consumption are eager to receive  
344 information about the safety of fish consumption and are more likely/willing to adopt consumption advice. The  
345 present study shows that 34.4% of the respondents had been eating more than three servings of fish per week,  
346 whereas 33.3% of consumers reported consumption of 2–3 servings per week. It was further noted that 24.4%  
347 of the studied population said that they had been consuming 1–2 servings of fish per week, while only 7.8%  
348 reported no consumption of fish at all. The fish consumption pattern in the study area is much lower than that  
349 near Lake Victoria in Tanzania, where 1–2 servings of fish per day was reported for the majority of the surveyed  
350 consumers and considerably large proportions (85.2%) of household members were seriously thinking of  
351 increasing the number of daily servings of fish they consumed for the improvement of their health (Wenaty et  
352 al. 2018). This variation might be the reason that perceptions are different between high-income and low-income  
353 settings. Likewise, consumers' age has been identified as a significant variable for adopting fish consumption  
354 advice. It is well established fact that age has a significant impact on fish consumption. In general, older people  
355 are more health-oriented than younger people (Olsen 2003) and, therefore, elderly people consume fish more  
356 often than younger people (Olsen 2003; Verbeke et al. 2005). As a result, the perception of fish as a healthy  
357 food increased with age (Verbeke et al. 2005). Moreover, Erdogan et al. (Erdoğan et al. 2011) reported a strong  
358 positive correlation between fish consumption and age. A more recent study found that fish was mostly  
359 consumed by adults aged over 45, compared to other age groups (Wenaty et al. 2018). There is no doubt that  
360 consumers' health concerns are a driver of increased fish consumption frequency (Danso et al. 2017). Concern  
361 about the safety of food has attracted consumer attention for many years and it was reported that a lack of access  
362 to high-quality fish leads to constraints on consumption (Myrland et al. 2000).

363 This study identified perceptions of fish consumption risks and benefits as important factors for the fish-  
364 consuming populace. We found that 35.6% of respondents expressed minimum levels of perceived risk related  
365 to fish consumption, whereas 32.2% of consumers reported a high level of risk. This finding is also in line with  
366 previous studies where a risk to safety was identified as a potential barrier to consuming fish more frequently  
367 (Verbeke et al. 2005). In another study, one-fifth of consumers claimed that fish was unsafe, with young  
368 respondents perceiving fish as less safe compared with other age groups. The same study also revealed that the  
369 perception of fish as safe tended to be stronger among families with children (Verbeke et al. 2005). Consumers'  
370 awareness of the perceived benefits of fish consumption was higher in the current study, with 47.8% of  
371 respondents reporting fish consumption as having health benefits compared to beef and pork consumption.  
372 Increased awareness of the health risks involved in the consumption of red meat has led many consumers to  
373 turn to fish consumption. In this study, consumers also confirmed their perception that fish consumption is  
374 beneficial, expressing moderate (47.8%) to high (37.8%) affirmation of the perceived benefits of consuming  
375 fish. This observed consumer perception is similar to other earlier observations reported for the fish-consuming  
376 population of Hanoi (Danso et al. 2017). Furthermore, the importance of consuming fish has been noted for  
377 people who live near Lake Victoria: 98.4% of the interviewed consumers indicated that the inclusion of fish in  
378 their diet provided health benefits (Wenaty et al. 2018). This study also found that availability of knowledge is  
379 an important factor determining fish consumption behaviour. It was also reported that consumers frequently eat  
380 fish if they believe that sustainable food is healthy (Danso et al. 2017). Therefore, making information available  
381 can play an important role in promoting the healthy consumption of fish. Overall, the most important factors  
382 adversely influencing fish consumption have been found to be the high price, low level of satiation, lack of trust  
383 in its safety, lack of knowledge on ways of judging the product's quality and in preparing the product, the  
384 presence of bones, the flavour and the perceived low availability of good fresh fish (Danso et al. 2017).

385 The present study found that most of the heavy metal concentration in the collected fish samples did not  
386 differ significantly according to the seasons, indicating the influence of an anthropogenic impact on Laguna  
387 Lake. A risk–benefit assessment has been defined as the weighing of the probability of an adverse health effect  
388 against the probability of a beneficial effect as a result of the intake of food (Berjia et al. 2012). Guidance on  
389 performing risk–benefit assessments of foods has been described in many studies (Berjia et al. 2012) (Du et al.  
390 2012; D.-P. Zhang et al. 2012). In the present study, for mudfish and tilapia, the HQefa values of the  
391 contaminants were found in the order of Hg > As > Pb > Cd > Cr. HQefa values greater than 1 indicate the  
392 potential that the metal may possess noncarcinogenic effects (Ricketts et al. 2020, Thomsen et al. 2019).  
393 Notably, in the study, mean values of HQefa for all the metals, except Cr in mudfish and tilapia and Cd in

394 tilapia, were higher than 1 in all of the study locations. In the case of mudfish, the mean HQ<sub>efa</sub> for Hg and Pb  
395 was calculated as 17.91 and 11.67, respectively, which indicated deleterious health effects for the intake of such  
396 fish in order to obtain the recommended portion of EFA.

397 The cluster analysis and vulnerability map produced in the study indicated that northern West Bay was the  
398 most vulnerable area of Laguna Lake in terms of the contamination of fish. Many studies have proven that the  
399 concentration of pollutants in fish follows the concentration of pollutants in the ambient water (Alam and  
400 Mohamed 2011). In the case of Laguna Lake, it was observed that the polluted tributary rivers were located in  
401 the western and northern parts of West Bay, where most of the population and the industrial establishments are  
402 concentrated (LLDA 2012), indicating the reason for the higher contamination in fish sampled from the northern  
403 West Bay in the present study.

404 Dietary advice is identified as a tool in health management (van der Gaag et al. 2020). Considering the  
405 contamination of fish, the maximum amount of fish consumption that can be consumed safely during dry and  
406 wet seasons was estimated for adults, children and women of childbearing age. As with the higher contamination  
407 recorded in northern West Bay, stricter consumption restrictions have been advised for those areas where As,  
408 Pb and Hg were the most significant elements contributing to the health risks. Similar to the present study,  
409 considering 0.227 kg of fish per meal for an adult, the consumption advice for two commercially valuable  
410 species of fish from the fresh and coastal waters of Ghana was set to nine meals/month, which was linked with  
411 the contamination of Hg (Gbogbo et al. 2018). Moreover, fewer than 10 meals of fish in a month was suggested  
412 for the consumption of freshwater fish due to the contamination of Pb in the largest tributary of the Karoon  
413 River of Iran (Majlesi et al. 2018). Both Hg and As have been recognised as noteworthy contaminants limiting  
414 fish consumption in the Persian Gulf, with a maximum allowable limit of one meal per month for children under  
415 six and 6–8 meals per month for adults (Raissy and Ansari 2014). Considering the importance of Laguna Lake  
416 and consumers' willingness to receive information about safe consumption, fish species from different areas  
417 within the lake should be monitored to produce suitable fish consumption advice.

## 418 5. Conclusions

419 The findings presented in this study clearly indicate that fish consumers in the Laguna Lake area recognise the  
420 importance of consuming fish but have concerns about the risks. However, very limited information is available  
421 about the risks and benefits of fish consumption in the region. Moreover, consumers' willingness to adopt  
422 consumption guidelines was influenced by various socioeconomic factors. This study pointed out that  
423 consumers with higher levels of fish consumption are keen to receive information about the safety of fish  
424 consumption and are more interested in adopting consumption advice to ensure their health. Considering this,  
425 the contamination scenarios for two commercially important fish species collected from Laguna Lake were  
426 analysed based on the most suitable dataset of heavy metal contamination in fish available in the literature, with  
427 the aim of formulating fish consumption advice. Our study identified potential noncarcinogenic health risks due  
428 to the contamination of heavy metals in both tilapia and mudfish collected from Laguna Lake. The most polluted  
429 locations explored by the cluster analysis and a vulnerability map were areas of northern West Bay. Following  
430 research on the contamination level, fish consumption advice was formulated, setting a lower consumption limit  
431 for fish collected from those areas. The consumption advice produced in this study can be considered as a  
432 pioneering initiative in the region that can be used as the basis for the further development of consumption  
433 advice.

434

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# Figures

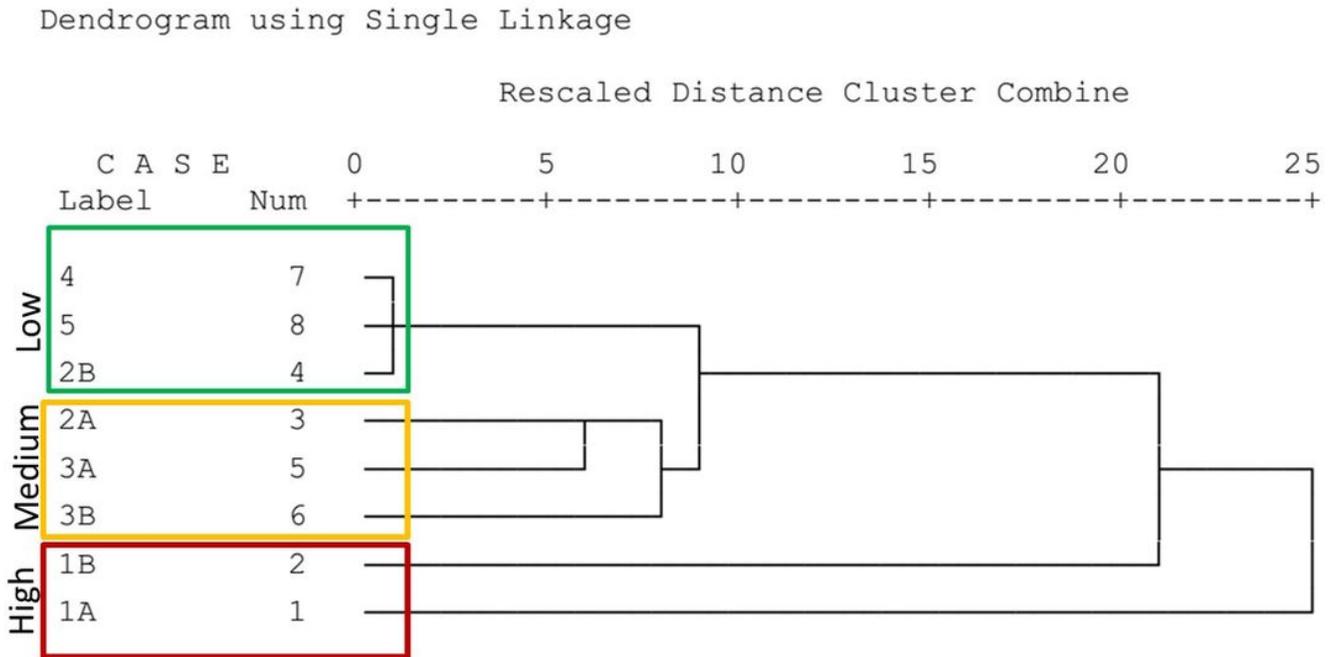
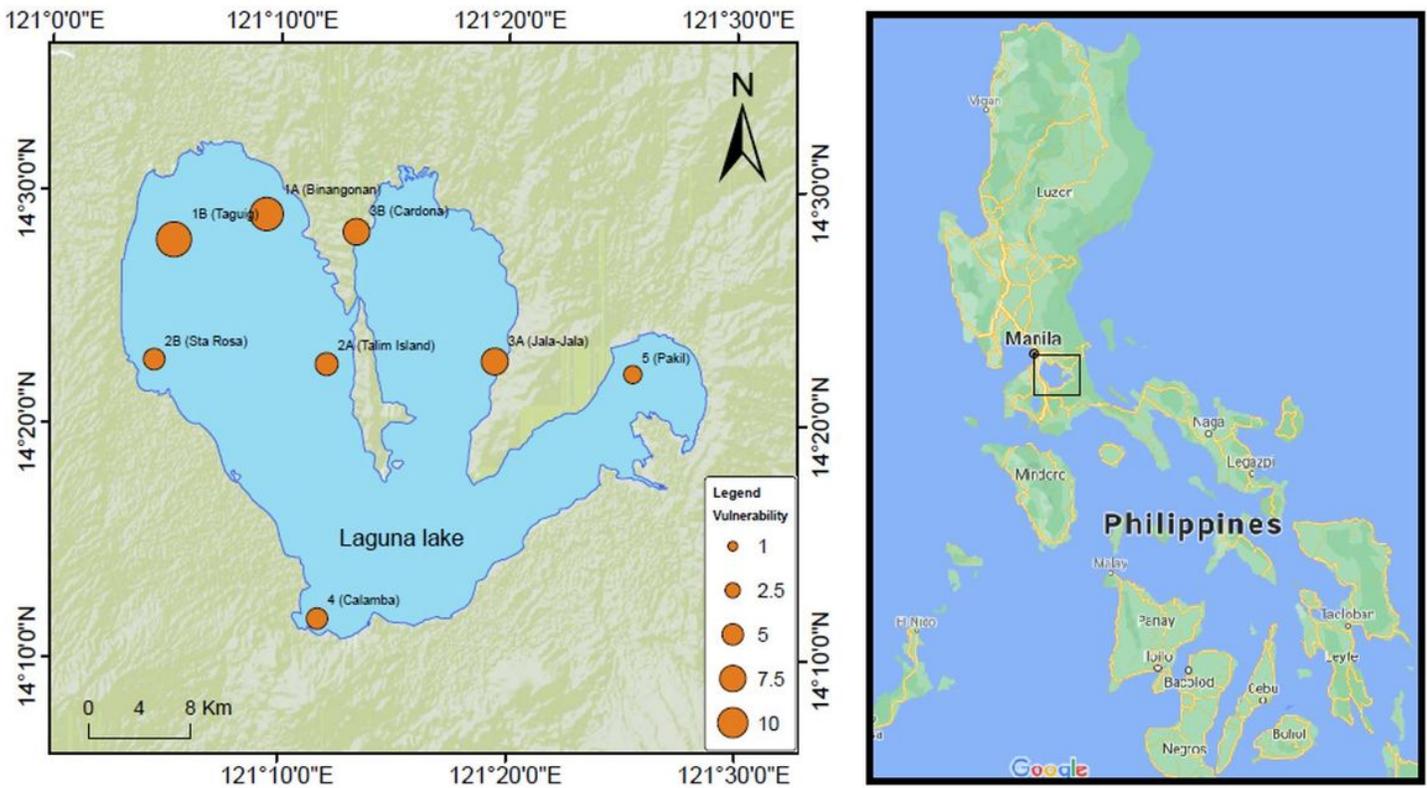


Figure 1

Hierarchical cluster analysis for heavy metal contamination in 8 stations in Laguna



## Figure 2

Vulnerability map of fish consumption risk at Laguna de Bay

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