

# A global assessment of species diversification in aquaculture

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## Abstract

Aquaculture is a diverse food production system, and a high species diversity in aquaculture can make the global food system more resilient. Species diversification could facilitate aquaculture growth through multiple mechanisms and increase the sector's resilience and long-term sustainability. Facing increasing challenges from climate change, disease outbreaks, market fluctuations, and other disturbances, species diversification has become a widely recognized and endorsed development strategy in the policy and scientific communities for the growth and resilience of the aquaculture sector. However, many attempts to establish new species have yielded little long-term success, and the private sector often concentrates efforts on the most advantageous species for rapid growth. This paper presents a comprehensive assessment of aquaculture species diversification at the global, regional (more than 30 country groups), and national (nearly 200 countries) levels, covering the period 1950 to 2020 with a focus on 1990 to 2020. The assessment employs the concept of "effective number of species" as a measure of diversity and uses two sub-indicators to assess within-group versus between-group diversity. The indicator system reveals detailed patterns of species diversity and uncovers different driving forces of species diversification. Additionally, the study maps the status and trends of species diversity to offer a refined perspective on species diversity profiles and diversification patterns. The findings reveal that beneath high species diversity in world aquaculture lies generally low diversity at the national level; nearly half of national aquaculture has no within-group or between-group diversity. Furthermore, species diversification has been losing momentum in recent decades, and concentration has become a more prominent development pathway, with a tendency to drive aquaculture towards a low-diversity system similar to terrestrial farming. Public interventions are crucial to promote species diversification in aquaculture for the sector's resilience and long-term sustainability. It is important to not only reduce the cost of species diversification for the private sector but also to dedicate more public efforts towards increasing its benefits and viability. While diverse diversification patterns among national aquaculture indicate no one-style-fits-all species diversification pathway, a country may draw guidance from others' experiences, especially since countries with similar species diversity profiles or diversification patterns tend to cluster geographically. Evidence-based policymaking and sector management regarding species diversification entail collaborative efforts among policymakers, scientists, and the aquaculture community to expand and refine assessment frameworks, improve data availability and quality, and efficiently utilize information, knowledge, and insights generated by these assessments to inform decision making at various levels.

**Keyword:** aquaculture; diversity; species diversification; effective number of species; within-group diversity; between-group diversity

## 47 **1. Introduction**

48 As a rapidly expanding sector in the food industry, aquaculture stands out for its diverse range of species  
49 compared to terrestrial farming, which could enhance the resilience of the global food system (Troell et  
50 al., 2014; FAO, 2019a). Since 1950, more than 600 aquatic species have been farmed in global  
51 aquaculture, with more than 400 species still being actively cultivated. Among these, ten species account  
52 for approximately half of the total production (FAO, 2019b). In contrast, two thirds of global crop  
53 production come from 10 species (out of less than 200 plant species with significant production globally),  
54 while only ~40 terrestrial animal species are cultivated for food such as meat, milk, and eggs, and  
55 production is concentrated in only a handful, though diversity comes from numerous breeds and varieties  
56 (FAO, 2019c).

57 High species diversity could also be advantageous for the aquaculture sector per se. Technically,  
58 species diversification can increase farming efficiency through polyculturing multiple species in the same  
59 farming system, cultivating the most suitable species in different farming environments, or rotating  
60 different species according to seasonal variations (Ravisankar et al., 2005; Thomas et al., 2021; Newton et  
61 al., 2021). Economically, species diversification can help the sector overcome market satiation and  
62 broaden its market base (Abellán and Basurco, 1999; Liao, 2000). Finally yet perhaps most importantly,  
63 species diversification can enhance aquaculture's resilience against climate change, disease outbreaks,  
64 market fluctuations, and other shocks that pose challenges to the sector's long-term sustainability (Wilson  
65 and Archer, 2010; Gephart et al., 2017; Metian et al., 2020). Therefore, species diversification is widely  
66 endorsed as a prominent strategy for sustainable aquaculture development by both policy and scientific  
67 communities (Abellán and Basurco, 1999; CIHEAM, 2000; Naylor and Burke, 2005; Brummett, 2007;  
68 Martínez-Cordero, 2007; Megahed and Mesalhy, 2009; Le Francois et al., 2010; FAO, 2011; Schmidt et  
69 al., 2011; Guy et al., 2014; Troell et al., 2014; Harvey et al., 2017; Roy, 2019; Boyd et al., 2020; Metian,  
70 et al., 2020; García-Márquez et al., 2021; Thomas et al., 2021; Oboh, 2022).

71 However, although aquaculture is one of the most diverse food production systems at the global level,  
72 species diversity is generally low in national aquaculture (Metian et al., 2020; Cai et al., 2022). Many

73 attempts to promote new species have yielded little long-term success (Metian et al., 2020; Harvey et al.,  
74 2017; Teletchea and Fontaine, 2014; Muñoz-Lechuga et al., 2018). Failure to establish a novel species  
75 could be attributed to various hindrances, such as technical difficulties (Fernández-Polanco and Bjorndal,  
76 2017), limited markets (Basurco and Abellán, 1999), or institutional constraints (Barrington et al., 2009).  
77 Yet fundamentally, when aquaculture species that appear promising individually compete for limited  
78 resources and markets, market mechanisms, such as economies of scale and maximization of risk-  
79 adjusted return, tend to make aquaculture production concentrated towards a few winner species (Cai et  
80 al., 2022).

81 Should a country pursue species diversification or adopt a “concentration” pathway to focus on a few  
82 most productive species for high growth and exploit their intra-specific potential for diversity? The  
83 answer tends to vary for different countries or for the same country at different stages of aquaculture  
84 development, as both pathways have pros and cons (Bilio, 2008; Teletchea and Fontaine, 2014).  
85 Information, knowledge, and understanding of past experiences of species diversification is crucial for  
86 guiding aquaculture development, especially for countries with a less developed aquaculture sector.

87 Here we conduct a comprehensive, in-depth assessment of aquaculture species diversification at the  
88 global, regional (30+ country groups), and national (~200 countries) levels. Our analysis covers seven  
89 decades (1950–2020), with an emphasis on the past three decades (1990–2020). Similar to Cai et al.  
90 (2022), we use the “effective number of species” as a measure of “true” diversity (Hill, 1973; Jost, 2006),  
91 which is more intuitive than the Shannon (entropy) index used by Metian et al. (2020). While Metian et  
92 al. (2020) quantified the diversity of aquaculture species at the national level, we measure it at the  
93 national, regional, and global levels. This helps identify inconsistent species diversification patterns at  
94 different geographic scales. We further decompose the effective number of species into two sub-  
95 indicators: one captures diversity among species groups (i.e. between-group diversity) and the other  
96 measures species diversity within species groups (i.e. within-group diversity). The decomposition reveals  
97 detailed patterns of species diversity and uncovers different driving forces of species diversification.  
98 Similar to Metian et al. (2020), we map species diversity to examine its geographic patterns. Yet the

99 scope of our mapping is broader, including both a comparison of species diversity across countries and a  
100 categorization of species diversification trends.

101 We highlight and discuss key findings in the main text. Some results may be part of conventional  
102 wisdom, yet most are less apparent or underappreciated. More comprehensive results are documented in  
103 supplementary materials, which can be used to facilitate evidence-based policymaking and sector  
104 management in aquaculture at the global, regional, and national levels. We conclude the paper with  
105 discussion of lessons learned, future prospects, and way forward, including potential areas for further  
106 study.

## 107 **2. Data and methods**

### 108 **2.1 Data**

109 We use aquaculture production statistics from the Food and Agriculture Organization of the United  
110 Nations (FAO) Global Aquaculture Production Statistics 1950–2020 (FAO, 2022). Reporting entities in  
111 the database are classified as countries, including non-sovereign territories. In order to facilitate analysis,  
112 we combine the statistics of mainland Tanzania and Zanzibar into the United Republic of Tanzania. For  
113 all other reporting entities, we use the classifications adopted in the FAO database. In addition to  
114 assessments at the country and global levels, we also examine species diversity and diversification  
115 patterns in 32 countries groups. For narrative convenience, we refer to aquaculture in these 32 groups as  
116 “regional aquaculture” (Table 1).

117 *[Insert Table 1 here]*

118 All ASFIS (Aquatic Sciences and Fisheries Information System) species items recorded in the  
119 database are included in our analysis. These species items could refer to individual species, hybrids or  
120 “nei” (not elsewhere included) species items that are groups of related species (e.g. genera) when  
121 identification to species was not recorded in the database (FAO, 2019b, 2020; Metian et al., 2020).  
122 According to the International Standard Statistical Classification of Aquatic Animals and Plants  
123 (ISSCAAP), the ASFIS species items fall into eight divisions: (i) marine fishes, (ii) freshwater fishes, (iii)  
124 diadromous fishes, (iv) crustaceans, (v) molluscs, (vi) aquatic plants, (vii) miscellaneous aquatic animals,

125 and (viii) miscellaneous aquatic animal products. We group the first three divisions into “finfish” and the  
126 last two into “miscellaneous aquatic animals and animal products” (abbreviated as “MAA”), and we  
127 rename “aquatic plants” into “algae” to more accurately reflect its species composition. As a result, we  
128 have five species groups (finfish, crustaceans, molluscs, MAA, and algae) for the examination of diversity  
129 within each group and between them. For narrative convenience, we will refer to the ASFIS species items  
130 simply as “species” throughout the rest of this article.

## 131 **2.2 Measuring species diversity**

132 As a unifying notation of commonly used measures of diversity (Hill, 1973), a general formula for the  
133 effective number of species is

$$134 \quad D_q = \left( \sum_{i=1}^n s_i^q \right)^{\frac{1}{1-q}} \quad (1)$$

135 where  $n$  represents the total number of species;  $s_i$  denotes the share of species  $i$  in the production of all  
136 species; and  $q$  indicates the order of diversity. When  $q = 0$ ,  $D_0 = n$  is equal to the total number of  
137 species, which measures solely richness and gives zero weight to evenness. As  $q$  increases, more weight  
138 is given to evenness in the measure of diversity. While efforts in biodiversity conservation may focus on  
139 species richness, evenness is a crucial dimension of species diversity for sustainable aquaculture  
140 development (Harvey et al., 2017).

141 Like Cai et al. (2022), we measure species diversity in aquaculture using the effective number of  
142 species at  $q = 1$ , i.e.

$$143 \quad \text{ENS} \equiv D_1 = e^{-\sum_{i=1}^n s_i \ln(s_i)}, \quad (2)$$

144 where the summation term is the Shannon index:

$$145 \quad H \equiv -\sum_{i=1}^n s_i \ln(s_i) = \ln(\text{ENS}). \quad (3)$$

146 The Shannon index is a well-known diversity index, and it was used by Metian et al. (2020) to map  
147 species diversity in global aquaculture. ENS is less widely used, but it is considered a more intuitive  
148 measure of true diversity (Hill, 1973; Jost, 2006). The scale of ENS ranges from 1 to the total number of

149 species ( $n$ ). When production is evenly distributed among all species, the ENS value is equal to  $n$ . The  
150 more uneven the distribution of production is, the closer the ENS value will be to 1.

151 ENS in equation (2) can be partitioned into two components:

$$152 \quad \text{ENS} = \text{WGENS} \times \text{ENSG}. \quad (4)$$

153 The first component (WGENS), which is a measure of within-group diversity, is calculated as a weighted  
154 geometric mean of ENS within different species groups (denoted as  $\text{ENS}_j$ ). As discussed in section 2.1,  
155 here we consider five species groups (finfish, crustaceans, molluscs, MAA, and algae). The weight  
156 assigned to each group is based on its share of total production (denoted as  $s_j$ ), i.e.

$$157 \quad \text{WGENS} = \prod_j (\text{ENS}_j)^{s_j}. \quad (5)$$

158 The second component (ENSG) represents the effective number of species groups, i.e.

$$159 \quad \text{ENSG} = e^{\sum_j -s_j \ln(s_j)}, \quad (6)$$

160 which measures the evenness of production distribution among the five species groups (i.e. between-  
161 group diversity). WGENS, ENSG, and ENS are equivalent to three diversity measures (alpha, beta, and  
162 gamma diversity, respectively) that have been used to assess biological diversity in an ecosystem (Jost,  
163 2007; Tuomisto, 2010). While ENS has been used in Cai et al. (2022) to facilitate benchmarking species  
164 diversification in aquaculture, this is the first study, to the best of our knowledge, to apply within-group  
165 diversity (WGENS) and between-group diversity (ENSG) as sub-indicators of species diversity in  
166 aquaculture.

167 According to equations (3)–(6), the Shannon index can also be partitioned into

$$168 \quad H = H_{\text{within}} + H_{\text{between}}, \quad (7)$$

169 where  $H_{\text{within}} = \sum_j s_j H_j$  and  $H_{\text{between}} = \sum_j -s_j \ln(s_j)$  are alternative measures of within-group and  
170 between-group diversity.

171 While ENS and its two components (WGENS and ENSG) are more intuitive diversity measures – see  
172 numerical examples at the beginning of section 3.1, the multiplicative partition of ENS in equation (4)  
173 makes it inconvenient to calculate the shares of WGENS and ENSG in ENS. Therefore, we used the

174 partition of the Shannon index defined in equation (7) to calculate the shares of within-group diversity  
175 and between-group diversity in overall species diversity:  $H_{\text{within}}/H$  measures the within-group share;  
176  $H_{\text{between}}/H$  measures the between-group share; and the two shares sum up to 100%. The within-group  
177 share can be further decomposed into the share of each species group in overall diversity (i.e.  $s_j H_j/H$ ).

### 178 **2.3 Categorizing changes in species diversity**

179 Table 2 presents six scenarios of ENS changes and six patterns of ENS trends. The six scenarios links a  
180 change in ENS to changes in its within-group and between-group components, while the six patterns  
181 categorize the trends of species diversification during three decades (1990–2020) or two decades (2000 –  
182 2020).

183 *[Insert Table 2 here]*

184 While originally used to measure biological diversity, the concept of “effective number” has been  
185 applied to measure diversity in other areas, such as the effective number of parties in a political system  
186 (Laakso and Taagepera, 1979) and the effective number of firms in an economy (Ordoover et al., 1982).  
187 Similarly, we use the “effective number of diversification patterns” (ENDP) to measure the diversity of  
188 the six patterns among countries (i.e. the evenness of the distribution of these six patterns among all  
189 countries worldwide or in the country group). The formula is

$$190 \quad \text{ENDP} = e^{-\sum_{i=1}^6 p_i \ln(p_i)}, \quad (8)$$

191 where  $p_i = n_i / \sum n_i$  measures the prevalence of diversification pattern  $i$  among countries, as  $n_i$  is the  
192 number of countries with pattern  $i$ . Similarly, equation (8) can be used to calculate the ENDP among  
193 regional aquaculture.

## 194 **3. Results**

### 195 **3.1 Species diversification in world aquaculture**

196 In 2020, a total of 448 species contributed the world aquaculture production of 123 million tonnes. Yet  
197 the production was concentrated on a much lower number of species – 46 species contributed 90% of the

198 production. The diversity of the species composition can be measured by the effective number of species  
199 (ENS) of 47.5 (Figure 1a).

200 While the 123 million tonnes of world aquaculture production spread across five species groups,  
201 finfish (46.9%), algae (28.6%), and molluscs (14.5%) contributed 90% of the production. The rest  
202 primarily came from crustaceans (9.2%), with a small amount of miscellaneous aquatic animals and  
203 animal products (MAA; 0.9%). As a measure of between-group diversity, the 3.5 effective number of  
204 species groups (ENSG) reflects this imbalanced taxonomic composition (Figure 1b).

205 In 2020, finfish accounted for nearly half of world aquaculture production, its species diversity  
206 (30.5 ENS) was also much higher than the other four species groups (Figure 1c–1g). The production of  
207 algae was nearly twice of molluscs, yet its species diversity (6.1 ENS) was lower than that of molluscs  
208 (9.4 ENS). The species diversity in crustaceans (4.9 ENS) was the lowest, whereas the 6.3 ENS of MAA,  
209 the smallest species group notwithstanding, was higher than algae and crustaceans. As a measure of  
210 within-group diversity, the 13.56 within-group ENS (WGENS) measures the average species diversity  
211 within these five species groups (Figure 1b).

212 In summary, world aquaculture production in 2020 (123 million tonnes) comprised 448 species, with a  
213 species diversity of 47.5 ENS. Between-group diversity (3.5 ENSG) accounted for 32% of the overall  
214 species diversity, whereas the rest 68% came from within-group diversity (13.56 WGENS), including  
215 41.5% from (species diversity within) finfish, 13.4% from algae, 8.4% from molluscs, 3.8% from  
216 crustaceans, and 0.4% from MAA.

217 *[Insert Figure 1 (colored) here]*

218 Historically, species diversity in world aquaculture more than doubled in four decades between 1950  
219 and 1990 through a “straight-up” diversification trend, with increased ENS in all eight mid-term (5-year)  
220 intervals during the period (Figure 1a). Species diversity increased further during the recent three decades  
221 (1990–2020), yet the diversification trend was less monotonic. Two ENS declines have resulted in an  
222 “inverted N-shape (H)” ENS trend that declined in the first decade (1990–2000) and the last decade



223 (2010–2020), whereas increased in the middle decade (2000–2010). The first decline occurred in the first  
224 half of the 1990s, with a partial recovery in the second half. A similar pattern occurred in the 2010s  
225 (Figure 1a).

226 The future will tell whether the second decline (during 2010–2020) was a temporary dip similar to the  
227 first one (during 1990–2000); or it may be the beginning of a longer term downward ENS trend in world  
228 aquaculture similar to the pattern for the rest of the world, excluding China (i.e. the ROW aquaculture)  
229 since 2000 (Supplementary Figure 1a). However, the downward ENS trend in world aquaculture in the  
230 third decade (2010–2020) differed from the downward trend in the first decade (1990–2000) in that the  
231 former was consistent with regional and national situations, whereas the latter was not.

### 232 **3.2 Inconsistent species diversification at different geographic scales**

233 In the first decade (1990–2000), species diversity declined in world aquaculture yet increased in most (22  
234 out of 32) regional aquaculture (Table 1; column X) as well as nearly two thirds of national aquaculture  
235 that accounted for nearly 90% of world production (Figure 2b). The inconsistency could seemingly be  
236 explained by the fact that species diversification in world aquaculture mimicked that of Asia, the largest  
237 aquaculture region that contributed more than 90% of world production (Table 1, column III). A deeper  
238 look, however, reveals another inconsistency: declined species diversity in Asia versus increased diversity  
239 in all five Asian sub-regions (Table 1; column X). A similar inconsistency occurred between 1990 and  
240 2020 when species diversity declined in Africa (as well as sub-Saharan Africa) while increased in all five  
241 African sub-regions (Table 1; column IX).

242 *[Insert Figure 2 (colored) here]*

243 Inconsistencies could occur not only on diversification trends but also on the status of species  
244 diversity. As China has been the largest national aquaculture with the most diverse species composition,  
245 one may expect that species diversity in world aquaculture should always be higher than diversity in the  
246 ROW aquaculture. The opposite occurred, nevertheless, in 1990 and 2000 (Table 1; columns IV and V).  
247 Such inconsistencies indicate that species diversification in world or regional aquaculture may not  
248 necessarily reflect situations in national aquaculture. After all, if every country cultivated a unique species

249 at the same amount, world aquaculture would have a high species diversity even with no species diversity  
250 at the national level.

### 251 **3.3 Decelerating species diversification**

252 During the three decades between 1990 and 2020, species diversity increased in most (22 out of 32)  
253 regional aquaculture. This, however, reflects the situation in the first and second decades (Table 1;  
254 Supplementary Table 1a), whereas species diversity declined in most (19) regional aquaculture in the  
255 third decade (Table 1; Supplementary Table 1b). Such decelerating diversification process also occurred  
256 in national aquaculture.

257 Between 1990 and 2020, species diversity increased in nearly three quarters of national aquaculture  
258 that accounted for more than 80% of world production (Figure 2a). The situations in the first decade  
259 (Figure 2b) and the second decade (Figure 2c) were consistent with the overall trend. Yet species  
260 diversity declined in a higher proportion of national aquaculture in the second decade compared with the  
261 first one (37% versus 34.6%), and the production share of countries with a declined species diversity in  
262 the second decade (23.7%; Figure 2c) nearly doubled the level in the first decade (11.9%; Figure 2b).  
263 Indeed, the 23.7% would be higher than the remaining 11.1% when China's production share (65%) is  
264 excluded from the 76.1% production share of national aquaculture with an increased diversity in the  
265 second decade (Figure 2c).

266 The diversification trend appeared to reach a turning point in the third decade when the prevalence of  
267 national aquaculture with an increased diversity declined to exactly 50%, and they contributed less than  
268 20% of world production (Figure 2d). The large decline in the production share of more diversified  
269 aquaculture was primarily due to the shift of China's aquaculture from diversification trends in the first  
270 and second decades to a concentration trend in the third decade. However, even when China's production  
271 share (58%) is excluded from the 81% production share of national aquaculture with a declined diversity  
272 in the third decade, the remaining 23% would still be higher than the 18.9% production share of those  
273 with an increased diversity (Figure 2d).

### 274 **3.4 Diverse species diversification patterns**

275 Among 196 national aquaculture in 2020, we identify six patterns of ENS trends (Table 2) for 161  
276 countries (Figure 2e). Most of the 161 ENS trends were 30-year trends between 1990 and 2020, with a  
277 few 20-year trends between 2000 and 2020 in case of no aquaculture production in 1990 (Figure 2e).  
278 Thirty-five relatively young national aquaculture, which accounted for less than 0.1% of world production  
279 in 2020, had no such 30- or 20-year trends, resulting in their exclusion from the six diversification  
280 patterns.

281 As species diversity increased in 89 countries (nearly two thirds of national aquaculture) in the first  
282 decade (Figure 2b) while declined in 91 countries (exactly half) in the third decade (Figure 2d), an  
283 inverted U-shape trend emerged as the prevailing pattern in national aquaculture during 1990–2020  
284 (Figure 2e). This most common pattern nevertheless occurred in only 59 countries (around one third).  
285 These 59 countries spread across Africa (17), Asia (17), Europe (12), the Americas (10), and Oceania (3),  
286 and they contributed nearly 80% of world production in 2020, including six of the top 10 largest national  
287 aquaculture (Figure 2e; Supplementary Table 2a).

288 The inverted N-shape pattern is similar to the inverted U-shape pattern in that both are associated with  
289 a decline in diversity in the third decade. While characterizing the ENS trend in world aquaculture, the  
290 inverted N-shape pattern occurred in only 18 countries that contributed to just half a percent of world  
291 production (Figure 2e; Supplementary Table 2b). This further exemplifies the inconsistency discussed in  
292 section 3.2. Straight-down, which is another pattern with a declined diversity in the third decade, was the  
293 least common pattern that occurred in only eight national aquaculture (0.2% of world production) (Figure  
294 2e; Supplementary Table 2c). In contrast, straight-up ENS trends occurred in 31 countries that accounted  
295 for 6.7% of world production; most of which are in Europe (14) or Asia (10) (Figure 2e; Supplementary  
296 Table 2d). U-shape and N-shape are another two patterns with increased diversity in the third decade,  
297 which occurred in 28 countries (4.8% of world production; Supplementary Table 2e) and 17 countries  
298 (8.5%; Supplementary Table 2f), respectively.

299 Based on equation (8), we calculate the effective number of diversification patterns (ENDP) to  
300 measure the diversity of diversification patterns, i.e. the evenness of the distribution of the six patterns

301 among countries. The results indicate diverse diversification patterns among national aquaculture: 5.06  
302 ENDP for the 161 national aquaculture worldwide, ~4–5 ENDP for national aquaculture in each of the  
303 five regions (from 4.34 ENDP for national aquaculture in Oceania to 5.03 ENDP for national aquaculture  
304 in the Americas), 5.21 ENDP for landlocked national aquaculture, and 4.51 ENDP for island national  
305 aquaculture (Supplementary Figure 2).

306 However, there were clusters of national aquaculture with the same or similar patterns (Figure 2e),  
307 such as (i) a cluster of (national aquaculture with) straight-up ENS trends in East-Central Europe; (ii) two  
308 clusters of U-shape or N-shape trends: one in South-Central Asia; the other stretching from the United  
309 States of America southward through Central America (except Nicaragua) to three of the four members of  
310 the Andean Community (Bolivia, Colombia and Peru, except Ecuador) as well as two associated members  
311 (Paraguay and Uruguay); and (iii) several clusters of inverted U-shape or inverted N-shape trends in (a)  
312 the Mediterranean Basin, (b) Western and Southern Africa, (c) the south and east parts of South America,  
313 and (d) three countries in Maritime Southeast Asia (Indonesia, Malaysia and Brunei Darussalam) plus  
314 Australia and New Zealand plus four nearby Pacific SIDS (Papua New Guinea, New Caledonia, Guam,  
315 and Palau).

316 The distribution of the six diversification patterns among the 32 regional aquaculture was similar to  
317 the situation in the 161 national aquaculture, i.e. inverted U-shape being the most common pattern  
318 (occurred in 14 regional aquaculture), followed by straight-up (6), U-shape (5), inverted N-shape (4), N-  
319 shape (2), and straight-down in only one regional aquaculture (Supplementary Table 3). The diversity of  
320 the six patterns among the 32 regional aquaculture was 4.5 ENDP.

### 321 **3.5 Within-group versus between-group diversity**

322 Within-group diversity contributed approximately 60 to 70% of species diversity in world aquaculture  
323 during 1950–2020. This share was generally on an upward trend, increasing from 63.1% in 1960 to  
324 67.5% in 2020 (Supplementary Figure 3). For the 32 regional aquaculture, the average within-group share  
325 in species diversity during 1990–2020 varied from 23% in Pacific Islands to 100% in Central Asia, yet  
326 the share was above 50% for most regional aquaculture with a few exceptions (Supplementary Table 4).

327 The pattern of within-group share in national aquaculture has remained relatively unchanged over  
328 1990, 2000, 2010 and 2020 (Supplementary Figure 4). In 2020, the within-group share in national  
329 aquaculture varied from zero to 100%, yet it was more than 50% in 126 of all 196 national aquaculture  
330 (Supplementary Figure 4d). These 126 countries (illustrated with different shades of blue in Figure 3d)  
331 accounted for more than 90% of world production.

332 *[Insert Figure 3 (colored) here]*

333 As highlighted in section 3.1, finfish diversity was the primary source that contributed more than 40%  
334 of species diversity in world aquaculture in 2020. For national aquaculture, finfish was the primary source  
335 of species diversity in 114 countries. Among all finfish farming countries, the median finfish share in  
336 species diversity was nearly 80% (Supplementary Figure 5b).

337 Apparently from Figure 1a and 1b, species diversification in world aquaculture mimicked the trend of  
338 within-group diversity. Similarly, within-group diversity has been the main driving force of species  
339 diversification in regional aquaculture (Table 1; Supplementary Tables 1a and 1b) and national  
340 aquaculture (Figure 2; Supplementary Figure 6). During 1990–2020, ENS increased in 109 national  
341 aquaculture; 93 of which had a higher WGENS (Figure 2a: U1 and U2), whereas 33 of 40 countries with  
342 a declined ENS had a lower WGENS (Figure 2a: D1 and D2). Similarly, within-group diversity was the  
343 primary driving force of species diversification in all three sub-decades (Figure 2b–2d).

344 In 2020, within-group diversity was the sole source of species diversity (ENSG = 1; the within-group  
345 share = 100%) in 67 national aquaculture; nearly all (65) of them farmed only finfish (Supplementary  
346 Table 5). Representing more than one third of all 196 national aquaculture notwithstanding, these 67  
347 countries contributed only half a percent of world production. They were mostly clustered in Africa,  
348 Central Asia, and Eastern and Central Europe (Figure 3d, highlighted in dark blue). Nearly half (29) of  
349 them are landlocked countries, including 24 Landlocked Developing Countries (LLDCs). Among 37  
350 landlocked countries (Supplementary Table 6), the within-group share in 2020 was equal to 100% in 29  
351 countries, above 90% in 34 countries, and above 60% in nearly all of them (except one country with no  
352 species diversity, i.e. ENS = 1).

353 As highlighted in section 3.1, between-group diversity accounted for around one third of species  
354 diversity in world aquaculture in 2020, which was lower than the contribution of finfish yet higher than  
355 each of the other four species groups. In 2020, between-group diversity was the primary source  
356 (compared with each of the five species groups) of species diversity in 61 countries (~30% of all 196  
357 national aquaculture). Among them, between-group diversity was greater than within-group diversity  
358 (ENSG > WGENS; the within-group share < 50%) in 55 countries that contributed 7.8% of world  
359 production (Supplementary Table 7). Most of these 55 countries, highlighted in warm colors in Figure 3d,  
360 were located in the Americas (24 countries; 57% of national aquaculture in the region) and Oceania (10  
361 countries; 53%). The remaining 21 countries were spread across the other three regions, with eight in  
362 Asia, seven in Europe, and six in Africa. More than half (28) of the 55 countries were island economies,  
363 including 22 Small Island Developing States (SIDS). These 28 island economies represented nearly half  
364 of 60 island aquaculture in 2020 (Supplementary Table 8).

365 During 1990–2020 and the three sub-decades, between-group diversity remained unchanged in ~30–  
366 40% of national aquaculture where only one species group was farmed, whereas it increased in most of  
367 the other countries (Supplementary Figure 7). During 1990–2020, between-group and within-group  
368 diversity moved in different directions in nearly 100 national aquaculture that accounted for nearly 20%  
369 of world production (Figure 2a: U2, U3, D2, and D3). Among them, ENSG dictated the direction of ENS  
370 trends in only 23 countries (7.7% of world production; Figure 2a: U3 and D3), including (i) 16 countries  
371 where increased between-group diversity drove up the overall species diversity in spite of declined or  
372 unchanged within-group diversity (6%; Figure 2a: U3; Supplementary Table 9a) and (ii) seven countries  
373 where overall species diversity declined because of between-group diversity despite increased or  
374 unchanged within-group diversity (1.7%; Figure 2a: D3; Supplementary Table 9b). The pattern of  
375 between-group diversity dictating the direction of species diversification in a small portion of national  
376 aquaculture occurred in all three sub-decades (Figure 2b–2d).

### 377 **3.6 Generally low (often no) diversity in national aquaculture**

378 In 2020, ENS varied from 1 to 28 among 196 national aquaculture, yet half of them were less than 2.5 and  
379 three fourths less than 4 (Figure 3a; Supplementary Figure 8). The median WGENS was below 2 (Figure  
380 3b), whereas the median ENSG was slightly above 1 (Figure 3c). Nearly half (94) of the 196 countries  
381 had no within-group or between-group diversity, including 82 countries (42% of all 196 national  
382 aquaculture) with no between-group diversity (ENSG = 1), 27 countries (14%) with no within-group  
383 diversity (WGENS = 1), and among them, 15 countries (8%) with neither (i.e. no species diversity;  
384 WGENS = ENSG = ENS = 1). No species diversity was a more common phenomenon within the five  
385 species groups (Supplementary Table 10). In 2020, finfish was the only species group with median ENS  
386 (among all countries that farmed finfish) above 2; molluscs was another species group (besides finfish)  
387 with median ENS greater than 1; and median ENS was equal to 1 for all the other three species groups  
388 (Supplementary Figure 9).

389 In 2020, countries with relatively low (below-median) ENS contributed less than 5% of world  
390 production, whereas a quarter of countries with the highest ENS contributed more than 90% (Figure 3a).  
391 Thirty-three countries had extraordinarily high diversity in terms of at least one of the eight diversity  
392 measures (ENS, WGENS, ENSG and ENS in each of the five species groups). Most (21) of these  
393 countries belonged to the top 50 national aquaculture (Supplementary Table 11), and China (the largest  
394 national aquaculture with extraordinarily high diversity in terms of all eight measures) contributed nearly  
395 60% of world production.

396 There were large national aquaculture with low species diversity, such as export-oriented aquaculture  
397 in Norway (1.5 million tonnes of production with 1.31 ENS) and Ecuador (0.8 million tonnes with 1.11  
398 ENS). A small national aquaculture could nevertheless have a high species diversity. For instance,  
399 Singapore, a high-income city state with strong consumer preferences for a variety of aquatic foods, had a  
400 small aquaculture sector (less than 5 000 tonnes of production in 2020) with the third highest species  
401 diversity among all national aquaculture (Supplementary Table 11).

### 402 **3.7 Correlations between production and diversity**

403 It has been recognized that larger aquaculture production tend to be associated with higher species  
404 diversity (Metian et al., 2020). Cai et al. (2022) found a positive correlation ( $r = \sim 0.6$ ) between  
405 aquaculture production and species diversity based on data from over 200 countries for three decades  
406 (over 5000 observations). They used this relationship to set benchmarks for species diversification.

407 The positive correlation between aquaculture production and species diversity raises the question of  
408 whether species composition would tend to become more diverse as aquaculture production grows bigger  
409 (i.e. species diversification as a natural course of aquaculture expansion). A closer examination that  
410 distinguishes between cross-sectional correlation (i.e., correlation between production and diversity for a  
411 number of countries in a specific time) and temporal correlation (i.e., correlation between production and  
412 diversity for a specific country over time) will shed light on this question.

413 In 2020, a strong, positive correlation between aquaculture production and ENS was found among all  
414 196 countries ( $r = 0.65$ ). This positive cross-sectional correlation was consistent across the years 1990–  
415 2020, with a median value of  $r = 0.64$  (Supplementary Table 12). In addition to the positive correlation  
416 between aquaculture production and overall species diversity, cross-sectional correlations between  
417 production and the two components of ENS (WGENS and ENSG) were also found to be positive, albeit  
418 weaker (median  $r = 0.24$  and  $0.34$ , respectively). So were the correlations between production and ENS in  
419 each of the five species groups, with median  $r$  varied from  $0.38$  for finfish to  $0.84$  for MAA  
420 (Supplementary Table 12). These positive cross-sectional correlations indicate that countries with a  
421 relatively large aquaculture production generally have a higher species diversity than those with a  
422 relatively small production.

423 Temporal correlation between a country's production and diversity over time is less straightforward.  
424 During 1990–2020, temporal correlation between production and ENS varied between  $-1$  and  $0.99$  in all  
425 countries, and it was positive in 55% of the countries (108 out of 196) yet negative in 45% (88 out of  
426 196), with the median  $r = 0.1$ . In 73 countries (37%), the temporal correlation was significantly positive  
427 ( $p$ -value  $< 0.05$ ), which indicates that these countries' aquaculture production and ENS generally moved  
428 in the same direction during the period. The temporal correlation was significantly negative in 49



429 countries (25%) where aquaculture production and ENS generally moved in different directions. In the  
430 rest 74 countries (38%), the temporal correlation was not statistically significant (Supplementary Table  
431 13). While these findings may be deemed evidence of generally positive, albeit weak, temporal  
432 correlation between production and ENS in national aquaculture during 1990–2020, such a generally  
433 positive relationship was less obvious in the first two decades (median  $r$  around  $-0.03$  in both periods)  
434 and became non-existent in the last decade (Supplementary Table 13). During the third decade (2010–  
435 2020), the temporal correlation between production and ENS was negative in more than half (101) of all  
436 189 national aquaculture with median  $r = -0.08$ . The correlation was significantly positive in 46 countries  
437 (less than 5% of world production) while significantly negative in 49 countries (over 20%)  
438 (Supplementary Figure 10; Supplementary Table 14). Similarly, there was a lack of generally positive  
439 temporal correlations between production and the other seven diversity measures (Supplementary Table  
440 13). These findings indicate that while countries with a larger aquaculture production tend to have a  
441 higher species diversity than those with a lower production, there is no obvious tendency that a country's  
442 species diversity would move in the same direction with its production. In other words, species  
443 diversification has no tendency to be a natural course of aquaculture expansion.

### 444 **3.8 Geo-clustering of countries with similar species diversity**

445 National aquaculture within close geographic proximity tend to have similar species diversity profiles.  
446 We have highlighted clusters of countries with similar diversification patterns in section 3.4 and those  
447 with similar diversity profiles in section 3.5. Here we systematically examine geo-clustering patterns by  
448 grouping countries into four categories according to their within-group and between-group diversity  
449 (Figure 3e).

450 In 2020, 48 countries (illustrated in blue in Figure 3e) had a relatively high (above-median) within-  
451 group diversity as well as a relatively high between-group diversity; all of them also had relatively high  
452 overall diversity (Supplementary Table 15a). This “both > median” category primarily includes 19  
453 countries in Asia (primarily Eastern and South-eastern Asia) and 11 countries in Europe (primarily

454 Western and Southern Europe). The rest spread in Africa (8 countries), the Americas (7), and Oceania (3).  
455 Representing less than a quarter of all 196 national aquaculture notwithstanding, “both > median” appears  
456 to be the most prominent pattern in the map (Figure 3e) because it includes nine of the top 10 countries  
457 with the largest land area, except Kazakhstan (Supplementary Table 16). This may reflect that abundant,  
458 diverse natural resources, such as indigenous species and suitable farm sites, tend to be conducive to high  
459 species diversity. Indeed, while Kazakhstan, like most landlocked countries, farmed only finfish hence  
460 had no between-group diversity, its overall species diversity was higher than three quarter of ~200  
461 national aquaculture because of its extraordinarily high species diversity in finfish aquaculture  
462 (Supplementary Table 11). The “both > median” category accounted for more than 90% of world  
463 production, including six of the top 10 national aquaculture, 20 of the top 30, and 25 of the top 50  
464 (Supplementary Table 15a).

465 In contrast, another 48 countries (illustrated in red in Figure 3e) in the category of “both < median”  
466 contributed only 1.5% of world production (Supplementary Table 15b). The contribution primarily came  
467 from Norway, which was the only top 10 largest national aquaculture with relatively low within-group  
468 diversity and between-group diversity; and Ghana was the only other top-50 national aquaculture in this  
469 category. A large proportion of the countries in the “both < median” category are located in Africa (21  
470 countries), and the rest spread across the other four regions: six in Asia (primarily Western Asia) and  
471 seven each in the Americas (primarily the Caribbean), Europe (primarily Northern Europe) and Oceania  
472 (entirely Pacific SIDS).

473 Fifty countries (illustrated in green in Figure 3e) had a relatively high within-group diversity yet a  
474 relatively low between-group diversity; most (36) of them had a relatively high overall diversity  
475 (Supplementary Table 15c). This category of “WGENSE > median; ENSG ≤ median” primarily includes  
476 16 countries in Asia (mostly landlocked countries in Central, Southern, or Western Asia), 15 countries in  
477 Europe (mostly East-Central Europe), and 13 countries in Africa (nearly half of them clustered in Western  
478 Africa). Only five countries in the Americas belonged to this category, which nevertheless included the  
479 only two landlocked countries in the region (Figure 3e). Indeed, most (24) of the 37 landlocked national

480 aquaculture worldwide, including 19 of the 31 LLDCs, belonged to this category. Landlocked  
481 aquaculture’s relatively low between-group diversity may primarily reflect their lack of coastal resources  
482 (needed for the farming of most algae and molluscs species) as well as their relatively low preferences for  
483 aquatic foods (Cai and Leung, 2022). The “WGENS > median; ENSG ≤ median” category accounted for  
484 2.2% of world production, including one top-10 national aquaculture (Egypt), two top-30, and nine top-50  
485 (Supplementary Table 15c).

486 Another 50 countries (illustrated in purple in Figure 3e) had a relatively high between-group diversity  
487 yet a relatively low within-group diversity, with a relatively low overall diversity in most (36) of them  
488 (Supplementary Table 15d). This is the exact opposite of the previous category. Nearly half (23) of the 50  
489 countries in this category of “WGENS ≤ median; ENSG > median” are in the Americas. This is  
490 nevertheless not obvious in Figure 3e, because these 23 countries include a cluster of 13 Caribbean SIDS  
491 indiscernible in the map. Indeed, more than half (28) of the 50 countries in this category are island  
492 economies, including 22 SIDS. While island states tend to have a relatively high between-group diversity  
493 thanks to long coastlines – algae and molluscs are primarily cultivated in marine areas, a small island  
494 aquaculture usually has a low within-group diversity because of small market (constrained by its small  
495 population and high transportation costs) and low production scale. Other clusters in the “WGENS ≤  
496 median; ENSG > median” category include (i) 10 countries in Central America, and the east and north  
497 coasts of South America; (ii) seven Pacific SIDS in Oceania, (iii) five countries in Northern Europe and  
498 (iv) five countries in South and South-eastern Africa (Supplementary 16d; Figure 3e). This category  
499 accounted for 5.5% of world production, including two top-10 national aquaculture (the Philippines and  
500 Chile), seven top-30, and 13 top-50 (Supplementary Table 15d).

## 501 **4. Discussion**

### 502 **4.1 Lessons learned**

503 Species diversification may not be consistent at different geographic scales (section 3.2). Hypothetically,  
504 if there were 200 countries each cultivating a unique species in equal amounts, the species composition of  
505 global aquaculture would be highly diverse (ENS = 200), even with no species diversity (ENS = 1) at the

506 national level. In reality, beneath high species diversity in world aquaculture lies low species diversity in  
507 most national aquaculture (section 3.6). Therefore, species diversification should be assessed at various  
508 levels (world, regional, sub-regional, national, and sub-national) for evidence-based policymaking and  
509 sector management in aquaculture.

510 Policy and planning for species diversification should take a holistic approach recognizing that species  
511 diversity in aquaculture is shaped by many factors, such as resource endowments, climate conditions,  
512 farming systems and technologies, consumer preferences, market structure, and institutional  
513 arrangements, among others (Guy et al., 2014; Metian et al., 2020; Cai et al., 2022). Species  
514 diversification in aquaculture tends to be a long-term, fluctuating process with diverse diversification  
515 patterns varying across countries (section 3.4).

516 A young aquaculture sector may start with a relatively high species diversity when farmers attempt to  
517 cultivate a variety of species in the exploratory stage (Brummett, 2007). Yet technical, market, or other  
518 breakthroughs would tend to first occur in the most promising species and result in production  
519 concentrated towards a few major species. The development of minor species, together with diminishing  
520 growth potential in major species because of various constraints, such as depletion of suitable farm sites,  
521 productivity limit, and market satiation, could turn the concentration process into a diversification trend  
522 with production expansion primarily driven by more advantageous minor species. These minor species  
523 may eventually become major species; then their further expansion could turn the diversification trend  
524 back into a concentration process.

525 Technical, economic, or institutional constraints may hinder the establishment of minor species,  
526 whereas the advantages of major species could be sustained or amplified by constant innovations,  
527 economies of scales, insatiable global market, or other facilitating factors. Under this situation, a  
528 concentration trend may go on for a long period. On the other hand, certain factors, such as high  
529 consumer preferences for new varieties of aquatic foods or aquaculture entrepreneurs' passion and  
530 perseverance in cultivating new species, may constantly bring about breakthroughs in new species to  
531 sustain a straight-up species diversification trend. Therefore, there is no one-style-fits-all species

532 diversification pathway, and species diversification may not be a suitable development strategy for all  
533 countries, or for a particular country at different stages of aquaculture development.

534 Species diversification could stimulate aquaculture growth under certain situations, such as (i)  
535 increasing market demand in places where consumers have high preferences over a variety of aquatic  
536 foods, (ii) improving farming efficiency through polyculture, or (iii) utilizing diverse farming  
537 environments and resources. However, instead of spreading efforts across a range of species,  
538 concentrating on the most advantageous ones tends to be a more effective way to promote aquaculture  
539 growth, especially in a young aquaculture sector that lacks capacities (e.g. entrepreneurship, technical  
540 expertise, and supply chain) to expand aquaculture through species diversification. For an aquaculture  
541 sector at its infancy, focusing on the most promising species would tend to result in production  
542 concentration towards a few major species. Not only can such species concentration facilitate rapid  
543 growth, it could also be a process of building capacities for the development of novel or minor species  
544 through spillover effects to lay a foundation for potential species diversification in the future.

545 Species diversification is often considered a panacea to addressing challenges faced by existing  
546 species, such as market satiation (Abellán and Basurco, 1999), low productivity (Carrera-Quintana et al.,  
547 2022), or disease outbreaks (Guy et al., 2014). Yet focusing on improving existing species could  
548 sometimes be a more effective way to address such challenges. For instance, after a shrimp disease  
549 outbreak in 1999 devastated Ecuador's aquaculture sector that was dominated by whiteleg shrimp  
550 (*Litopenaeus vannamei*), the recovery was not via species diversification but through improving shrimp  
551 farming regulations and management (Marcillo, 2017). As a result, the share of whiteleg shrimp in the  
552 country's aquaculture production increased from 82% in 2000 to 98% in 2020, and the country  
553 experienced rapid aquaculture growth at a rate of 13.5% a year, compared to 7.7% in South America,  
554 5.7% in the Americas, and 5.4% in world aquaculture.

555 In contrast with enthusiasm in the public sector, the private sector is often more cautious about species  
556 diversification because establishing novel species tends to be a technically challenging, financially  
557 demanding, time-consuming, and risky process that may deter even an advanced aquaculture sector

558 (Harvey et al., 2017). For instance, Norway’s attempt to diversify its salmon-dominated aquaculture  
559 industry through the farming of Atlantic cod (*Gadus morhua*) was hindered by technical difficulties (e.g.  
560 knowledge gaps in intensive cod juvenile production, inadequate broodstock development, and high  
561 mortality) and foiled by competition from increased wild cod production (Fernández-Polanco and  
562 Bjorndal, 2017; Puvanendran et al., 2021).

563 Institutional arrangements may be a subtle yet important factor affecting species diversification. While  
564 measures for biodiversity conservation may constrain diversification via non-native species, regulations  
565 that force farmers to internalize the impacts of their operations on the ecosystem could motivate them to  
566 adopt a more diversified farming system, such as Integrated Multi-trophic Aquaculture (IMTA) of finfish,  
567 bivalves, and seaweeds (Cai et al., 2021). An aquaculture sector comprised by numerous small or  
568 medium-scale farmers could be more conducive to species diversification than one dominated by a few  
569 large operators. Small or medium entrepreneurs tend to have more incentives to pursue species  
570 diversification as a means to gain competitive advantages because it is easier for them reap the full benefit  
571 of a successful diversification by shifting their entire operations to the new species. In contrast, large  
572 operators usually lack such flexibilities, and new species may encroach the market of their existing  
573 species. Conversely, large operators tend to be better rewarded by concentrating efforts on strengthening  
574 their dominance in established species to benefit from economies of scale along the supply chain.

#### 575 **4.2 Future prospects**

576 Accumulated efforts (e.g. domesticated seed, tailor-made feed, and dedicated marketing) in improving  
577 the performance of established species, which are usually the most advantageous species in the first place,  
578 would tend to further strengthen their dominance and make aquaculture production concentrated towards  
579 a few winner species. Indeed, species concentration has become an increasingly prominent aquaculture  
580 development pathway in recent decades (section 3.3 and 3.7).

581 The characteristics of modern aquaculture (e.g. monoculture, formulated feed, specialized seed  
582 production, global markets, and industrialized operations), which tend to facilitate the accumulation of  
583 economies of scale along the supply chain, are conducive to fostering winner species (Cai et al., 2022).

584 Increasingly stringent restrictions over the use of non-native species in aquaculture for biodiversity  
585 conservation could facilitate initial species diversification among indigenous species, such as the case of  
586 tilapia farming in Malawi (Cai et al., 2022). In the long run, however, the production may have a  
587 tendency to concentrate towards a few local winner species, which could result in high species diversity  
588 in world aquaculture cum low diversity in national aquaculture.

589 On the demand side, consumers' willingness to pay for novelty and variety is a crucial factor to  
590 motivate and sustain species diversification, yet such willingness tends to be weak in countries with low  
591 consumer preferences for aquatic foods. Unfortunately, most countries have relatively low preferences for  
592 aquatic foods, and these countries are expected to be the primary contributors to world population growth  
593 (Cai and Leung, 2022).

594 In light of these supply- and demand-side factors that are unfavourable to species diversification, we  
595 envision that the decelerating trend of species diversification in recent decades (section 3.3) would tend to  
596 continue and eventually drive aquaculture towards a low-diversity system similar to terrestrial farming,  
597 unless there are effective public interventions to turn the tide.

### 598 **4.3 Way forward**

599 Diversity is one of the 10 elements of agroecology that have been synthesized to guide the transition to  
600 sustainable food and agricultural systems (FAO, 2018). Public interventions to facilitate species  
601 diversification in aquaculture are beneficial for the sector's resilience and long-term sustainability. Public  
602 support has largely focused on reducing the cost of species diversification for the private sector. This  
603 includes research in areas such as species selection methods and criteria (Abellán and Basurco, 1999;  
604 Leung et al., 2007; Le Francois, 2010; Alvarez-Lajonchère and Ibarra-Castro, 2013) as well as  
605 development projects such as breeding programmes (Harvey et al., 2017). There has also been a strong  
606 emphasis on building close partnership between research and the industry (Metian et al., 2020).

607 More public efforts should be dedicated to increasing the benefits and viability of species  
608 diversification, such as (i) promoting farming systems and technologies that are conducive to species  
609 diversification (e.g. polyculture); (ii) market development to increase consumer preferences for aquatic

610 foods and foster diverse dietary habits and culinary cultures; and (iii) creating policy and business  
611 environments that encourage long-term investments and award entrepreneurship.

612 While funding and other supports to develop potential species for aquaculture would always be  
613 worthwhile in the long run, limited capacities (e.g. natural resources, human resources, and markets) do  
614 not allow all promising species to establish at the same time. Therefore, prioritization is necessary for  
615 efficient allocation of limited public resources, and a country may seek guidance from species  
616 diversification pathways in other countries, especially with geo-clustering of countries with similar  
617 species diversity profiles or diversification patterns (section 3.4 and section 3.8).

618 For instance, while efforts in promoting species diversification have been mostly focused on finfish  
619 diversity (Le Francois et al., 2010), between-group diversity deserves more attention in light of the  
620 finding of no between-group diversity in more than 40% of national aquaculture (section 3.6). Nearly all  
621 landlocked national aquaculture had virtually no between-group diversity, and the experiences of two  
622 exceptions (i.e. a relatively high between-group diversity in Central African Republic and Chad because  
623 of the farming of spirulina) may not offer much guidance because of their low production scale  
624 (Supplementary Table 6). China's experiences in inland aquaculture could provide useful guidance in this  
625 regard (Newton et al., 2021). Better yet, landlocked countries may learn from the global experiences of  
626 relatively high between-group diversity in inland aquaculture of different scales. For example, in 2020,  
627 Singapore had a nearly 700-tonne inland aquaculture production, with a between-group diversity of 2.04  
628 ENSG. Other inland aquaculture sectors with a relatively high between-group diversity include Chile  
629 (nearly 2 000 tonnes with 1.86 ENSG), Spain (nearly 20 000 tonnes with 1.54 ENSG), and Taiwan  
630 Province of China (over 100 000 tonnes with 1.72 ENSG), among others (Supplementary Table 17).

631 Based on ENS as an intuitive diversity measure, Cai et al. (2022) established a benchmarking system  
632 to synthesize global experiences to guide policy and planning for species diversification in national  
633 aquaculture. The in-depth assessment conducted here could expand the benchmarking system to  
634 incorporate the measures of within-group diversity (WGENS) and between-group diversity (ENSG)  
635 (section 2.2). The two measures provide important insights about the sources of species diversity in



636 aquaculture (section 3.5), such as relatively low between-group diversity in landlocked countries versus  
637 relatively low within-group diversity in small island states (section 3.8). It has been recognized that the  
638 impact of biological diversity on the resilience of a dynamic ecosystem depends on the diversity of  
639 functional groups and the species diversity within these groups (Elmqvist et al., 2003). Similarly,  
640 different sources of species diversity in aquaculture would tend to influence its contribution to the sector's  
641 growth and resilience. Further study in this area is worthwhile.

642 ENS and its within- and between-group components, which correspond to gamma, alpha and beta  
643 diversity in ecology, should become a standard indicator system widely used in the study of species  
644 diversity in aquaculture and mainstreamed in policy dialogues. The within- and between-group partition  
645 here is based on the categorization of five customary taxonomic groups; other partitions can be adopted  
646 according to different planning or research purposes.

#### 647 **4.4 Concluding remarks**

648 The results of our systematic assessment have uncovered a wealth of information that sheds light on  
649 species diversification in aquaculture. We document the comprehensive results in the supplementary  
650 materials (including a summary in Supplementary Table 18) to facilitate further analysis. Policymakers  
651 and practitioners can use this information to inform their decision-making at the national, regional, and  
652 global levels. However, the usefulness of these results depends on the quality of the underlying data. The  
653 existence of *nei* species items in the FAO statistics, i.e. inadequate data disaggregation at the species level  
654 (section 2.1) affects accuracies in the measure of species diversity (FAO, 2020; Metian et al., 2020). Cai  
655 et al. (2022) used an example to demonstrate that this thorny issue tends to have a less impact on ENS as  
656 a diversity measure that captures both richness and evenness, because *nei* species items are usually  
657 associated with relatively small production. However, the data imperfection tends to hinder more in-depth  
658 analyses, such as examining species richness and evenness separately. Joint efforts from all stakeholders  
659 (governments, international organizations, research communities, the private sector, and others) are  
660 needed to narrow the data gap.

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