

# Optimal biodiversity loss in multispecies fisheries

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## Abstract

As marine ecosystems are under pressure worldwide, many scientists and stakeholders advocate the use of ecosystem-based approaches for fishery management. In particular, management policies are expected to account for the multispecies nature of fisheries. However, numerous fisheries management plans remain based on single-species concepts such as Maximum Sustainable Yield (MSY) and Maximum Economic Yield (MEY), that respectively aim at maximizing catches or profits of single species or stocks. In this study, we assess the sustainability and profitability of multispecies MSY and MEY in a mixed fishery with technical interactions. First, we analytically show how multispecies MSY and MEY can induce overharvesting and extinction of species with low productivity and low monetary value. It implies that multispecies harvesting policies can entail major biodiversity loss. Second, we identify and discuss incentives on effort costs and landing prices, as well as technical regulations, that could

14 promote biodiversity conservation and more globally sustainability. However it turns  
15 out that these incentives can be very demanding in economic terms, which significantly  
16 questions the bio-economic relevance of MMSY-MMEY strategies for operationalizing  
17 the ecosystem approach. Finally, a numerical example based on the coastal fishery in  
18 French Guiana illustrates the analytical findings.

## 19 **Keywords**

20 Multispecies fishery, ecosystem-based fisheries management, maximum sustainable yield,  
21 maximum economic yield, overexploitation, technical interaction

## 22 **1 Introduction**

23 Accelerating losses in marine biodiversity are affecting the productivity and the re-  
24 siliance of marine and coastal ecosystems worldwide (Worm et al., 2006). These changes  
25 are significantly due to increasing fishing pressures (McWhinnie, 2009), and induce se-  
26 vere economic loss in world fisheries (Willmann et al., 2009).

27 As a consequence, designing management tools and public policies that ensure the  
28 long-term bioeconomic sustainability of marine fisheries has become a major chal-  
29 lenge (FAO, 2014). In response, many scientists and experts advocate the use of an  
30 ecosystem-based fishery management (EBFM) (Pikitch et al., 2004), that aims at in-  
31 tegrating the ecological and economic complexities of fisheries, instead of focusing on  
32 isolated target species.

33 However, the way to operationalize the EBFM approach remains challenging (Sanchirico  
34 et al., 2008; Doyen et al., 2013), especially from the bioeconomic viewpoint. New mod-  
35 els are needed, to integrate the multiple complexities at play (Plagányi, 2007). These  
36 models are expected to account for the multispecies nature of fisheries, as well as for  
37 the multiple ecosystem services they provide. They should also help evaluating the  
38 bioeconomic effectiveness and sustainability of current regulatory instruments such as  
39 fishing quotas or financial incentives, and designing relevant ecosystem-based manage-

40 ment tools (Patrick and Link, 2015). Our paper intends to give some insights into these  
41 EBFM issues through the investigation of multispecies optimum yield policies.

42 Many fish stocks are currently managed to reach their maximum sustainable yield  
43 (MSY), through limitations on fishing quotas or efforts (Mace, 2001). At MSY, catches  
44 are maximized at levels where the stock can regenerate. This strategy has been set  
45 as the main reference point of many world fisheries, and has been introduced in the  
46 US' Magnuson-Stevens Act (NOAA, 2007), and more recently in the European Union's  
47 Common Fishery Policy (European Union, 2013). However the sustainability of this  
48 monospecific strategy in multispecies contexts is disputed (Larkin, 1977). In partic-  
49 ular, applying MSY policies from single-species assessments in multispecies trophic  
50 communities has been shown to induce biodiversity losses (Walters et al., 2005).

51 Instead of MSY, many resource economists advocate the use of maximum economic  
52 yield (MEY) targets, at which profits are maximized (Dichmont et al., 2010). Har-  
53 vesting at MEY is notably known to favor higher biomasses than harvesting at MSY  
54 (Clark, 2010). In a single-species context, harvesting at MEY is thus a more profitable  
55 and viable strategy than maximizing yield. In that perspective, maximum economic  
56 yield has been chosen as a reference point for Australian fisheries, although its im-  
57 plementation remains difficult (Dichmont et al., 2010; Pascoe et al., 2015). However,  
58 maximizing profits from a single stock can also induce overexploitation and extinction,  
59 provided its price is higher than the cost of depleting the stock (Clark, 1973). More-  
60 over, in a dynamical context, extinction can follow from maximization of present value,  
61 whenever discount rates are sufficiently high (Clark, 1973; Clark and Munro, 1975).

62 To account for the multispecies nature of fisheries, there have been suggestions to set  
63 objectives at the level of the fishery, by defining multispecies reference points (Moffitt  
64 et al., 2015). However, the potential bioeconomic consequences of such multispecies  
65 harvesting policies remain largely unknown. There have been attempts at defining  
66 multispecies MSY (MMSY) policies, at which total catches are maximized (Mueter  
67 and Megrey, 2006). But in mixed fisheries where technical interactions occur, that  
68 is when one fishing fleet harvests different species, maximizing total yields has been

69 suggested to endanger some species (Ricker, 1958; Legović and Geček, 2010; Guillen  
70 et al., 2013).

71 Potential consequences of multispecies MEY (MMEY), at which total profits are  
72 maximized, have also been investigated (Anderson, 1975). As in the single-species case,  
73 MMEY is found to be more profitable than MMSY (Guillen et al., 2013). However, it  
74 has been suggested that a combined MEY is susceptible to induce the overexploitation  
75 of stocks with low value (Chaudhuri, 1986; Clark, 2006; Guillen et al., 2013). In other  
76 words, if a multispecies fishery is seen as a portfolio of natural assets, maximizing total  
77 profits implies to neglect the conservation of inferior assets, thus inducing biodiversity  
78 losses (Swanson, 1994).

79 The aim of this paper is to evaluate and compare the bioeconomic merits of mul-  
80 tispecies MSY and MEY policies respectively, as well as to question their relevance  
81 for operationalizing ecosystem-based management. We use a bioeconomic model with  
82 multiple species and a single fleet, that allows us to derive analytical conditions for  
83 sustainable MMSY and MMEY. Thereby, we build a general analytical framework to  
84 understand the impacts of MMSY and MMEY in multispecies fisheries with technical  
85 interactions. In particular, we determine the biodiversity losses induced by such mul-  
86 tispecies strategies. We also describe technical and monetary regulations mitigating or  
87 preventing these biodiversity losses, to allow for the sustainable exploitation of species  
88 at MMSY and MMEY. These analytical results are used to assess the performances of  
89 multispecies strategies on a coastal fishery in French Guiana.

## 90 **2 Bioeconomic model**

### 91 **2.1 Dynamical model and equilibrium**

92 We consider  $N$  species harvested by a single fleet. It is assumed that no ecological  
93 interaction occurs between species. The dynamics of every species  $i = 1, \dots, N$  is thus

94

described by the following discrete time equation:

$$x_i(t+1) = x_i(t)(1 + r_i - s_i x_i(t) - q_i e(t)), \quad (1)$$

95

where  $x_i(t)$  denotes the stock of species  $i$  at time  $t$ ,  $r_i$  its intrinsic rate of growth,  $s_i$  the

96

intraspecific competition term,  $q_i > 0$  its catchability and  $e(t)$  the fishing effort at time

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$t$ . In usual models of logistic growth, the intraspecific competition term is  $s_i = r_i/K_i$ ,

98

where  $K_i$  is the carrying capacity of the species, or its strictly positive equilibrium

99

stock when unharvested. Equilibrium conditions relating stocks and effort are given by

$$x_i = \frac{r_i - q_i e}{s_i} \quad (2)$$

100

Stocks at equilibrium thus decrease linearly with the fishing effort, and the stock col-

101

lapses when the effort reaches  $r_i/q_i$ .

102

## 2.2 Definition of overharvest

103

In accordance with (FAO, 2014), we consider that a species is overharvested if its

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biomass is smaller than MSY levels. In the case of a logistic dynamics given by (1), it

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is well-known that MSY, where catch at equilibrium is maximal, is characterized by

$$x_i^{MSY} = \frac{r_i}{2s_i} \quad \text{and} \quad e_i^{MSY} = \frac{r_i}{2q_i} \quad (3)$$

106

The equilibrium condition (2) can then be written

$$x_i = x_i^{MSY} \left( 2 - \frac{e}{e_i^{MSY}} \right). \quad (4)$$

107

Consequently, the equilibrium biomass of species  $i$  is smaller than its MSY biomass

108

when the global harvesting effort is larger than the monospecific MSY effort of this

109

species. A species is thus considered overharvested when the harvesting effort is larger

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than its monospecific MSY effort. On the contrary, if it is smaller than the MSY effort,

111 the species is underharvested. If it is equal to the MSY effort, the species is said to be  
 112 fully exploited.

### 113 **2.3 Multispecies maximum sustainable yield**

114 Expanding the concept of MSY to multispecies and ecosystem contexts, we define  
 115 the multispecies maximum sustainable yield (MMSY) as the situation where the total  
 116 catches are maximized at equilibrium. The optimisation problem reads as follows:

$$\max_e \sum_{i=1}^N x_i q_i e, \quad (5)$$

117 Replacing  $x_i$  with its equilibrium expression (2), and differentiating the resulting for-  
 118 mula relatively to  $e$ , we obtain the fishing effort at MMSY:

$$e^{MMSY} = \frac{1}{2} \frac{\sum_{i=1}^N r_i q_i s_i^{-1}}{\sum_{i=1}^N q_i^2 s_i^{-1}}. \quad (6)$$

119 This expression is a generalization of the formula derived by Legović and Geček (2010).

### 120 **2.4 Multispecies maximum economic yield**

121 Similarly, extending the concept of MEY to multispecies frameworks, the multispecies  
 122 maximum economic yield (MMEY) aims at maximizing total profits, defined as the  
 123 difference between total revenues and total costs. The optimisation problem reads as  
 124 follows:

$$\max_e \sum_{i=1}^N x_i p_i q_i e - ce, \quad (7)$$

125 where  $c$  is the unit fishing cost of effort, and  $p_i$  is the price of species  $i$ . Replacing  
 126 again  $x_i$  with its equilibrium expression (2), and differentiating the resulting formula  
 127 relatively to  $e$ , we identify the MMEY fishing effort:

$$e^{MMEY} = \frac{1}{2} \frac{\sum_{i=1}^N r_i p_i q_i s_i^{-1} - c}{\sum_{i=1}^N p_i q_i^2 s_i^{-1}} \quad (8)$$

128 Introducing the average cost per species, namely the costs per unit effort divided by  
 129 the number of species  $\tilde{c} = c/N$ , we obtain

$$e^{MMEY} = \frac{1}{2} \frac{\sum_{i=1}^N (r_i p_i q_i s_i^{-1} - \tilde{c})}{\sum_{i=1}^N p_i q_i^2 s_i^{-1}}. \quad (9)$$

130 This expression is similar to the formula derived by (Clark, 2006), with  $s_i = r_i/K_i$ .

## 131 3 Sustainability of MMSY

### 132 3.1 Comparing multispecies and monospecies strategies

133 We now intend to compare the global MMSY effort with monospecific efforts at MSY  
 134 in order to characterize its sustainability. As captured by the following proposition,  
 135 it turns out that the global effort at MMSY as defined in (6) directly relates to the  
 136 different monospecific efforts  $e_i^{MSY}$  of equation (3):

137 **Proposition 1.** *The effort at MMSY is a convex combination of monospecific MSY*  
 138 *efforts:*

$$e^{MMSY} = \sum_{i=1}^N \alpha_i e_i^{MSY}, \quad \text{with weights} \quad \alpha_i = \frac{q_i^2 s_i^{-1}}{\sum_{j=1}^N q_j^2 s_j^{-1}} \quad \text{in } ]0, 1[. \quad (10)$$

139 In other words, the effort at MMSY is a weighted mean of all monospecific MSY  
 140 efforts  $e_i^{MSY}$  since the sum of  $\alpha_i$  is equal to 1. It thus depends on both the monospecific  
 141 MSY efforts of all harvested species and their respective weights.

142 Monospecific MSY efforts are positively correlated with the ratios  $r_i/q_i$ , called by  
 143 Clark (2010) the *biotechnical productivities* of the harvested species. Monospecific MSY  
 144 efforts thus depend positively on the rate of growth  $r_i$  and negatively on the catchability  
 145  $q_i$  of the harvested species. The MMSY effort is expected to be close to the MSY effort  
 146 of a species if this species is given much weight in the calculation. In particular, the  
 147 weight  $\alpha_i$  of a species is high when its catchability is high and intraspecific competition  
 148 is low.

## 3.2 Overharvest and extinction

Hereafter, a species is considered to be overharvested if the MMSY effort is superior to its monospecific MSY effort. To simply classify overharvested and underharvested stocks, the species are supposed to be ranked as follows:

$$e_1^{MSY} \leq e_2^{MSY} \leq \dots \leq e_N^{MSY}, \quad (11)$$

all efforts being positive. The following proposition, claiming that at least one species will be overharvested at MMSY, can be derived:

**Proposition 2.** *If at least two species differ in the sense that  $e_i^{MSY} < e_j^{MSY}$ , then at least species 1 is overharvested and at least species  $N$  is underharvested.*

**Proof.** *Species 1 is overharvested at MMSY if the following difference is positive:*

$$\sum_{i=1}^N \alpha_i e_i^{MSY} - e_1^{MSY} = \sum_{i=1}^N \alpha_i (e_i^{MSY} - e_1^{MSY}), \quad (12)$$

as  $\sum_{i=1}^N \alpha_i = 1$ . From (11), this sum is greater or equal to zero. But if at least two species differ in the sense that  $e_i^{MSY} < e_j^{MSY}$ , then this sum becomes strictly positive. Species 1 is then overharvested at MMSY. Using a similar proof relying on the ranking (11), it can be shown that species  $N$  is always underharvested at MMSY.

It follows that at MMSY, as soon as at least two monospecific MSY efforts do not coincide, the species with the lowest monospecific MSY effort will always be overharvested, while the species with the highest monospecific MSY effort will always be underharvested. The sensitivity of a species to overharvest at MMSY depends on the so-called biotechnical productivity  $r_i/q_i$ , species with lower biotechnical productivities being more prone to overharvesting. This is exemplified with two species in Figure 1a: both species display the same catchabilities, but as species 1 displays a lower growth rate than species 2, species 1 is overharvested while species 2 is underharvested.

Furthermore, maximizing total catches leads to the extinction of species  $i$  if the effort at MMSY is superior to the effort at which species  $i$  goes to extinction,  $r_i/q_i$ .

172 The effort at MMSY then has to be re-calculated with all remaining species. This case  
 173 is illustrated in Figure 1b, where species 1 disappears at MMSY; the total maximum  
 174 yield then corresponds to the yield of species 2. The different outcomes in Fig. 1a and  
 175 Fig. 1b are due to a change in the catchability of species 2. It shows that modifying  
 176 catchabilities through technical regulations on fishing gears can help regulating fishing  
 177 patterns. This issue is examined in the next subsection.

### 178 3.3 Selectivity policy for conservation

179 As pointed out previously, especially by Propositions 1 and 2, overharvesting and  
 180 extinction at MMSY result from differences between species and more quantitatively  
 181 between the monospecific MSY efforts  $e_i^{MSY}$  of harvested species. Thus, bringing these  
 182 efforts closer can promote coexistence and sustainability at MMSY. Decision makers  
 183 can achieve such a sustainability goal by regulating the catchability on the different  
 184 species through selectivity of gears.

185 **Proposition 3.** *Defining new catchabilities  $(q'_1, \dots, q'_N)$  so that for all  $i$  and  $j$ ,  $r_i/q'_i =$   
 186  $r_j/q'_j$  makes it possible to sustainably harvest all species at MMSY.*

187 **Proof.** *If  $\forall i, j \in \{1, \dots, N\}$   $r_i/q'_i = r_j/q'_j$ , then  $e_i^{MSY} = e_j^{MSY}$ . Thus,  $\forall i$ ,  $e^{MMSY} =$   
 188  $e_i^{MSY} = e_j^{MSY}$ .*

189 Balancing catchabilities with growth rates can thus improve sustainability at MMSY.  
 190 This idea of harvesting species in relation to their growth rates, known as balanced har-  
 191 vesting, has been suggested as a more sustainable alternative to the selective harvest of  
 192 groups of species (Zhou et al., 2010). An example of balanced harvest is shown for two  
 193 species on Figure 1c. In this example, the catchability of the species with the highest  
 194 growth rate (species 1) is reduced so as to equalize all biotechnical productivities.

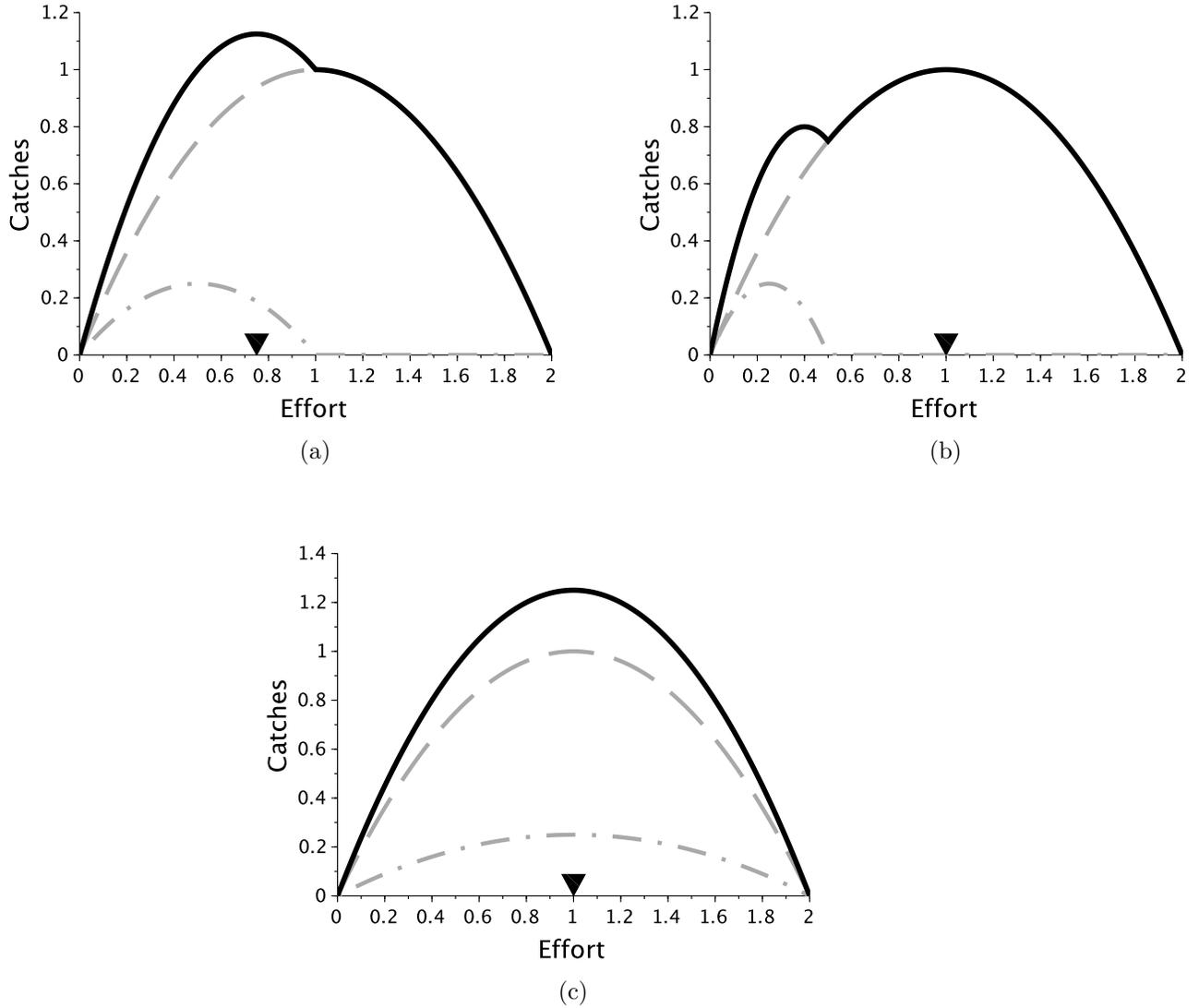


Figure 1: Multispecies maximum sustainable yield (MMSY) for two species. Catches are shown for increasing harvesting efforts. Black lines represent total catches. Dot-dashed grey lines and dashed grey lines respectively represent catches of the species with the lowest growth rate (species 1), and of the species with the highest growth rate (species 2). Black triangles indicate MMSY efforts at which total catches are maximized. (a) Parameters are set to  $r_1 = 1$ ,  $r_2 = 2$ ,  $s_1 = s_2 = 1$ ,  $q_1 = 1$ ,  $q_2 = 1$ . (b) Idem, except  $q_1 = 2$ . (c) Idem, except  $q_1 = 0.5$ .

## 4 Sustainability of MMEY

### 4.1 Comparing multispecies and monospecies strategies

In the same vein than for MMSY, we now aim at comparing the formulation of the MMEY effort with monospecific efforts at MEY. As shown in (Clark, 2010), monospecific MEY efforts with costs  $c$  are equal to

$$e_i^{MEY} = \frac{r_i}{2q_i} \left(1 - \frac{cs_i}{p_i q_i r_i}\right). \quad (13)$$

As all species are harvested with a shared cost  $c$ , we consider an average cost by species  $\tilde{c}$  defined previously and a corresponding MEY effort  $\tilde{e}_i^{MEY}$ . The following proposition directly derives from this characterization:

**Proposition 4.** *The effort at MMEY can be written as a convex combination of monospecific MEY efforts with costs  $\tilde{c}$ :*

$$e^{MMEY} = \sum_{i=1}^N \beta_i \tilde{e}_i^{MEY} \quad \text{with weights} \quad \beta_i = \frac{p_i q_i^2 s_i^{-1}}{\sum_{j=1}^N p_j q_j^2 s_j^{-1}} \quad \text{in } ]0, 1[. \quad (14)$$

Therefore the effort at MMEY is a weighted average of monospecific MEY efforts  $\tilde{e}_i^{MEY}$ . Again, the effort at MMEY thus depends on the monospecific MEY efforts of all harvested species, and on their respective weights. The weight of a species is high when its catchability and price are high and intraspecific competition is limited. Species with high prices thus display high monospecific MEY efforts and high weights in the MMEY computation.

### 4.2 Overharvest and extinction

As previously, we consider that if the MMEY effort is superior to the MSY effort of a species, this species is overharvested at MMEY. Furthermore, if the effort at MMEY is higher than the effort at which species  $i$  goes to extinction, then this species collapses at MMEY. In such a case of extinction, the effort at MMEY has to be re-calculated with

216 all preserved species. As regards overharvesting, Proposition 4 entails that MMEY is  
 217 more detrimental to species with low monospecific MEY efforts or low weights. This is  
 218 the case of species with low growth and price, and high intraspecific competition and  
 219 catchability. For instance in Fig. 2a, species 1 is overharvested as it displays a lower  
 220 growth and a lower price than species 2.

221 In single-species equilibrium models, MEY has been shown to be more sustainable  
 222 than MSY (Clark, 2010), in the sense that it induces higher levels of stocks at equilib-  
 223 rium as compared to MSY. We want to know whether this result still holds in mixed  
 224 fisheries. Comparing efforts at MMSY and MMEY as designed in Propositions 1 and  
 225 4, we obtain the following relationship:

$$e^{MMEY} > e^{MMSY} \Leftrightarrow \sum_{i=1}^N \beta_i e_i^{MSY} > \sum_{i=1}^N \alpha_i e_i^{MSY} + \frac{c}{2 \sum_{i=1}^N p_i q_i^2 s_i^{-1}}. \quad (15)$$

226 From this expression, we derive the following proposition:

227 **Proposition 5.** *It is possible to find systems of prices, catchabilities and costs for*  
 228 *which MMEY is less sustainable than MMSY ( $e^{MMEY} > e^{MMSY}$ ). In particular, it*  
 229 *can occur when species with high MSY efforts (or high biotechnical productivities) are*  
 230 *associated with high prices.*

231 **Proof.** *See the following examples.*

232 Let us consider that  $\forall i \neq j, q_i = q_j = q$  and  $s_i = s_j = s$ . Then,

$$e^{MMEY} > e^{MMSY} \Leftrightarrow \sum_{i=1}^N \frac{p_i}{\sum_{j=1}^N p_j} e_i^{MSY} > \sum_{i=1}^N \frac{1}{N} e_i^{MSY} + \frac{c}{2q^2 s^{-1} \sum_{i=1}^N p_i}. \quad (16)$$

233 Let us now assume that costs are null,  $c = 0$ . The condition becomes:

$$e^{MMEY} > e^{MMSY} \Leftrightarrow \sum_{i=1}^N \frac{p_i}{\sum_{j=1}^N p_j} e_i^{MSY} > \sum_{i=1}^N \frac{1}{N} e_i^{MSY}. \quad (17)$$

234 The effort at MMEY is higher than the effort at MMSY if the price-weighted average of  
 235 MSY efforts is higher than the simple average of MSY efforts. This occurs if high MSY

236 efforts are associated with high prices. If costs are non-null, then the MMEY effort can  
 237 also be higher than the MMSY effort as illustrated by Fig. 2b with two species. This  
 238 is due to the fact that species 1 is characterized by both the highest growth and price,  
 239 and that costs are relatively low.

## 240 4.3 Conservation incentives

241 As stressed in Proposition 5, maximizing total profits can entail unsustainability in  
 242 multispecies contexts. Thus, it makes sense to investigate incentives promoting sus-  
 243 tainable outcomes. We focus on two economic parameters, namely costs and prices,  
 244 that significantly influence the intensity of harvest at MMEY.

### 245 4.3.1 Incentives on costs

246 The effort at MMEY depends on the variable costs of harvesting  $c$ . In particular, an in-  
 247 creased cost decreases all monospecific MEY efforts (13) and reduces the global MMEY  
 248 effort (14). Thus we can derive a lower bound on effort cost promoting sustainability  
 249 of the ecosystem. Consider indeed the following threshold

$$c_{sus} = \max_k \sum_{i=1}^N \frac{p_i q_i^2}{s_i} \left( \frac{r_i}{q_i} - \frac{r_k}{q_k} \right) \quad \forall k \in \{1, \dots, N\} \quad (18)$$

250 We obtain the following result:

**Proposition 6.**

$$\text{If } c \geq c_{sus}, \quad (19)$$

251 *then the MMEY effort is inferior or equal to the lowest monospecific MSY effort, and*  
 252 *no species is overharvested at MMEY.*

253 **Proof.** *The result directly stems from Proposition 1.*

254 In other words, if costs are sufficiently high, then no species is overharvested at  
 255 MMEY. In terms of regulation and public policies, such a situation can be obtained  
 256 for instance by introducing taxes on fuel or on the amount of time spent at sea. An

257 example of such a tax is exemplified in Figure 2, where species 2 is overharvested when  
 258 the cost is low (Fig. 2a) and fully harvested when the cost is high (Fig. 2c). In this  
 259 example, the cost of conservation is 2 times higher than the initial cost. To facilitate  
 260 the acceptance of such an increase, it could be associated with incentives on prices.

### 261 4.3.2 Incentives on prices

262 As species with low prices are associated with low monospecific MEY efforts and low  
 263 weights in the MMEY calculation, risks of their overexploitation and extinction are  
 264 major. On the contrary, species with high prices display a higher weight, and are less  
 265 vulnerable in terms of overexploitation. Thus, incentives relying on prices are expected  
 266 to mitigate extinction risks and improve sustainability at MMEY.

267 **Proposition 7.** *For all species  $i$ , if  $e_i^{MSY} < e^{MMEY}$ , subsidizing price to  $p'_i = p_i + \tau_i$   
 268 reduces the MMEY effort. Likewise if  $e_i^{MSY} > e^{MMEY}$ , taxing price to  $p'_i = p_i - \tau_i$   
 269 reduces the MMEY effort. In other words, subsidies on overharvested species and taxes  
 270 on underharvested species improve sustainability at MMEY.*

271 **Proof.** *See Appendix A.2.*

272 Proposition 7 implies that decreasing prices of species with high monospecific MSY  
 273 efforts can reduce overharvest at MMEY. In particular, on ecosystems with only two  
 274 species, it is possible to define a theoretical price at which overharvest vanishes: let us  
 275 consider two species, 1 and 2, with  $r_2/q_2 > r_1/q_1$ . We have

$$e^{MMEY} \leq e_1^{MSY} \Leftrightarrow p'_2 \leq \frac{q_1}{q_2} \frac{cs_2}{r_2q_1 - r_1q_2}, \quad (20)$$

276 with  $p'_2 = p_2 - \tau_2$  the new price of species 2. The price of species 2 can thus be  
 277 reduced to make the MMEY effort reach the lowest MSY effort. An example is shown  
 278 in Figure 2, where species 1 is overharvested when the price of species 2 is high (Fig.  
 279 2a) and fully harvested when the price of species 2 is low (Fig. 2d). In this example,  
 280 the new price is 2 times lower than the initial price. As fishers can be reluctant to

281 such a sharp decrease, it could turn out to be more efficient to combine subsidies on  
282 overharvested species and taxes on underharvested species. This is generalized in the  
283 following proposition:

284 **Proposition 8.** *A system of subsidies and taxes on species that are respectively over-*  
285 *harvested and underharvested at MMEY can be found that allows to avoid overharvest-*  
286 *ing at MMEY.*

287 **Proof.** *See Appendix A.3. We use a corollary of Farkas' lemma to show that it is*  
288 *always possible to find a vector of prices that satisfies inequality (19).*

289 Consequently, through a fine-tuned system of subsidies and taxes, overharvest can  
290 be avoided at MMEY. Such a system could turn out to be more acceptable to fishermen  
291 than either increasing costs or reducing prices of underharvested species. Incentives  
292 on prices could also be used jointly with incentives on costs to achieve a sustainable  
293 MMEY. However, price and cost incentives for a sustainable MMEY are expected to  
294 come at a cost for governments and fishers.

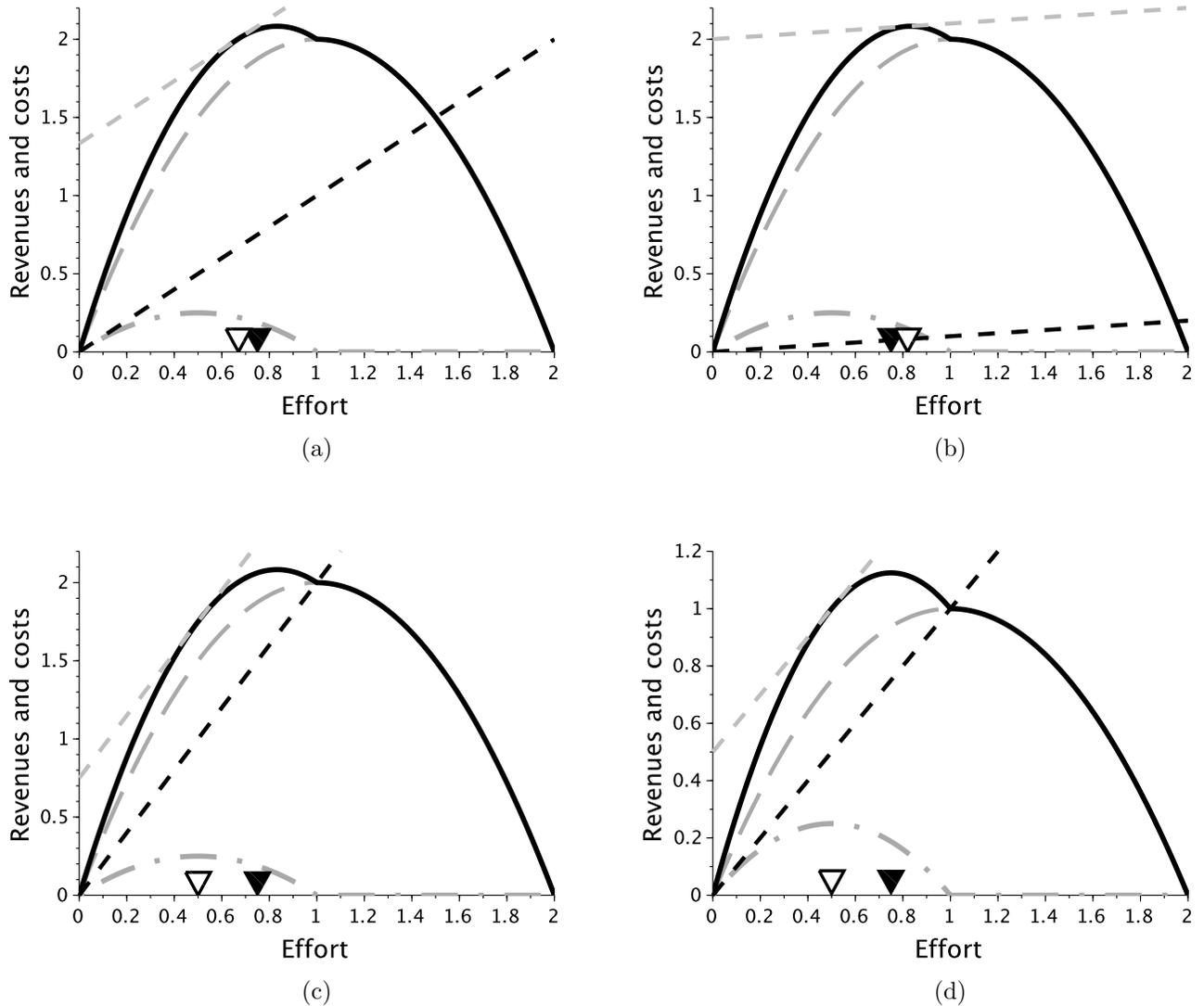


Figure 2: Multispecies maximum economic yield (MMEY) for two species. Revenues and costs are shown for increasing harvesting efforts. Plain black lines represent total revenues, while dashed black lines represent costs of harvesting. Dot-dash dark-grey lines and dashed dark-grey lines respectively represent revenues that arise from catching the species with the lowest growth rate (species 1), and the species with the highest growth rate (species 2). Black triangles indicate MMSY efforts at which total catches are maximized. White triangles indicate MMEY efforts at which total profits are maximized. At this effort, the slope of the tangent to the revenue curve (the dashed light-grey line) is equal to the slope of the cost curve. (a) Parameters are set to  $r_1 = 1$ ,  $r_2 = 2$ ,  $s_1 = s_2 = 1$ ,  $q_1 = 1$ ,  $q_2 = 1$ ,  $p_1 = 1$ ,  $p_2 = 2$ ,  $c = 1$ . (b) Idem, except  $c = 0.1$ . (c) Same as (a), except  $c = 2$ . (d) Same as (a), except  $p_2 = 1$ .

## 5 Case study: coastal fishery in French Guiana

### 5.1 Calibration

We apply our analytical results to the coastal artisanal fishery in French Guiana, which has been studied by Cissé et al. (2013) and Cissé et al. (2015). This small-scale fishery involves four fleets and thirty species. Cissé et al. (2013) only consider 13 species that capture an important part of the catches (88% between 2006 and 2009). This fishery is modeled by a Lotka-Volterra model in discrete time, and parameters are calibrated with monthly catch data from 2006 to 2010.

To apply this calibration to our results, we use two simplifying assumptions. First, we consider that ecological interactions are negligible, as in the calibration from (Cissé et al., 2015), trophic interactions coefficients are at least  $10^5$  times lower than intraspecific competition coefficients. As in this calibration two top predator species (sharks and groupers) display negative rates of growth, we do not take them into account in this study. We thus focus our analysis on 11 harvested species.

Second, we consider that the proportion of each fleet remains constant. As in Guillen et al. (2013), a global effort multiplier is thus applied. This is equivalent to considering that all species are harvested by a single aggregate fleet, and that the catchability of species  $i$  is  $q_i = \sum_{j=1}^4 e_j q_{ij} / \sum_{j=1}^4 e_j$ , its price is  $p_i = \sum_{j=1}^4 p_{ij} q_{ij} e_j / \sum_{j=1}^4 q_{ij} e_j$ , and the associated cost is  $c = \sum_{j=1}^4 e_j c_j / \sum_{j=1}^4 e_j$ , where  $e_j$  is the mean effort of fleet  $j$  between 2006 and 2010,  $q_{ij}$  is the catchability of species  $i$  by fleet  $j$ ,  $p_{ij}$  is the price of species  $i$  when harvested by fleet  $j$ , and  $c_j$  is the cost associated with fleet  $j$ . Calibrated parameters used for the analyses are shown in Table 1.

Table 1: Calibrated parameters from the coastal fishery in French Guiana, adapted from (Cissé et al., 2015). The growth rate, intraspecific competition term, catchability and price of each considered species is indicated. The average effort between 2006 and 2010 is equal to 182 hours per day (as several fleets are active in parallel), and the average cost is approximately equal to 7.5 euros per fishing hour.

Species $i$	Abbreviations	Growth rate $r_i$ ( $10^{-2}$ ) (/month)	Intraspecific competition $s_i$ ( $10^{-8}$ ) (/kg /month)	Catchability $q_i$ ( $10^{-7}$ ) (/h)	Landing price $p_i$ (EURO)
Acoupa weakfish	A.w.	2.08	0.033	2	2.30
Crucifix sea catfish	C.s.c.	5.95	0.41	0.79	1.11
Green weakfish	G.w.	0.17	0.0057	2	1.56
Common snooks	C.s.	2.47	1.46	9	2.60
Smalltooth weakfish	S.w.	0.64	0.069	1	2.55
South American silver croaker	S.A.s.c.	3.44	4.15	4	2.47
Tripletail	T.	9.34	18.34	8	1.44
Gillbacker sea catfish	G.s.c.	1.94	5.77	32	2.12
Bressou sea catfish	B.s.c.	4.52	18.02	5	1.54
Flathead grey mullet	F.g.m.	5.31	16.90	3	2.85
Parassi mullet	P.m.	6.71	31.08	4	2.68

## 5.2 Results

We use the calibration from Cissé et al. (2013) to compute the impacts of multispecies strategies on the sustainability and the profitability of the fishery. To assess the sustainability of harvesting strategies, we compute the deviation from the MSY biomass (see Eq. 3) of each of the harvested species. If the deviation is positive, the biomass is higher than the biomass at MSY, indicating that the species is underharvested. On the contrary, if the deviation is negative, the species is overharvested and if it reaches  $-100\%$ , the species is extinct.

Results are shown in Figure 3. Both MMSY and MMEY strategies lead to the extinction of Green weakfish, Common snooks and Gillbacker sea catfish. This can be explained by the relatively low growth rates of Green weakfish and Gillbacker sea catfish, and the high catchabilities of Common snooks and Gillbacker sea catfish (see Table 1). At MMSY, Smalltooth weakfish is also extinct, while only overharvested at MMEY. This results from the (relatively) high price of this species. More species are thus extinct at MMSY than at MMEY. The state of remaining species is also better at

332 MMEY than at MMSY. In particular, while Acoupa weakfish, Tripletail and Bressou  
 333 sea catfish are overharvested at MMSY, they become underharvested at MMEY. In  
 334 this example, maximizing total profits is thus more sustainable than maximizing total  
 335 catches.

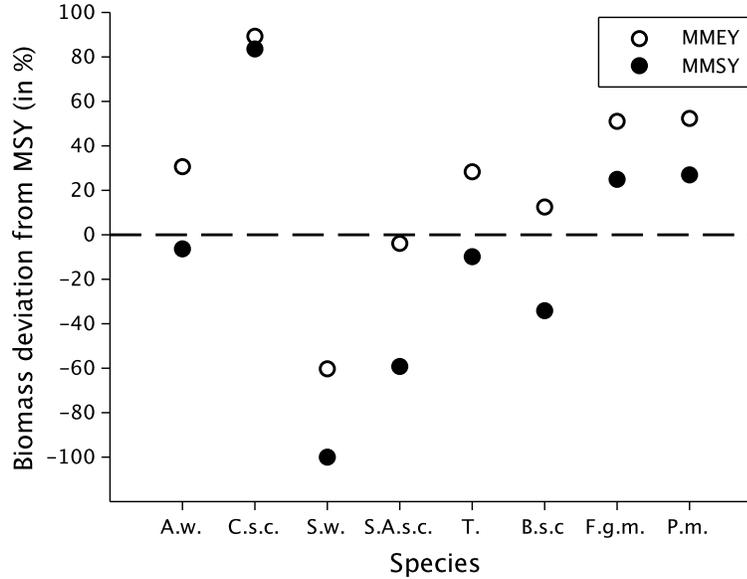


Figure 3: Sustainability of MMSY and MMEY policies in the coastal fishery in French Guiana. Deviation of the harvested species’ biomasses from their MSY levels are shown. A  $-100\%$  deviation indicates that the species is extinct. As the Green weakfish, the Common snooks and the Gillbacker sea catfish are extinct at MMSY and MMEY, their corresponding deviations are not shown on this figure. Abbreviations are explained in Table 1.

336 We next assess the impact of harvesting strategies on ecological and economic objec-  
 337 tives. We use the total profits per month as an economic objective and the biodiversity  
 338 as an ecological objective. Biodiversity is measured with a Shannon index, equal to

$$SI = - \sum_{i=1}^N u_i \log(u_i), \quad (21)$$

339 where  $u_i = x_i / \sum_{i=1}^N x_i$  is the proportion of biomass from species  $i$  in the system (see  
 340 for instance (Zhang et al., 2016)). This index is low if the number of species is low,  
 341 but also if a great part of total biomass is represented by a single or a few species. It

342 is thus more informative than the mere number of surviving species. We compare four  
343 different strategies: the status quo situation, where the harvesting effort corresponds to  
344 the mean effort between 2006 and 2010, the MMSY strategy, the MMEY strategy and  
345 a sustainable MMEY strategy, at which there is no overharvested species. To reach  
346 this point, we increased costs according to Proposition 6. As sustainable strategies  
347 based on price incentives yield similar results (as they fulfill the same sustainability  
348 conditions), we choose not to represent them here.

349 As illustrated by Figure 4, both profits and biodiversity are higher at MMEY than  
350 at MMSY. Moreover, as compared to the status quo situation, profits increase by more  
351 than 60% at MMEY, but the biodiversity is negatively impacted. In fact at MMEY,  
352 a supplementary extinction occurs, namely that of Common snooks, compared to the  
353 status quo situation. In that respect, we compute the cost at which MMEY is com-  
354 pletely sustainable. Initially, mean variable costs are equal to approximately 7.55 euros  
355 per fishing hour. The calculated sustainable cost is approximately equal to  $c_{sus} = 36.13$   
356 euros per fishing hour. Thus, the sustainable cost is almost five times as high as the  
357 initial cost. Although there are ecological gains, profits at the sustainable MMEY are  
358 more than 30 times lower than profits at the initial MMEY. In the MMEY perspective,  
359 there is thus a clear trade-off between conserving biodiversity and generating profits in  
360 the fishery.

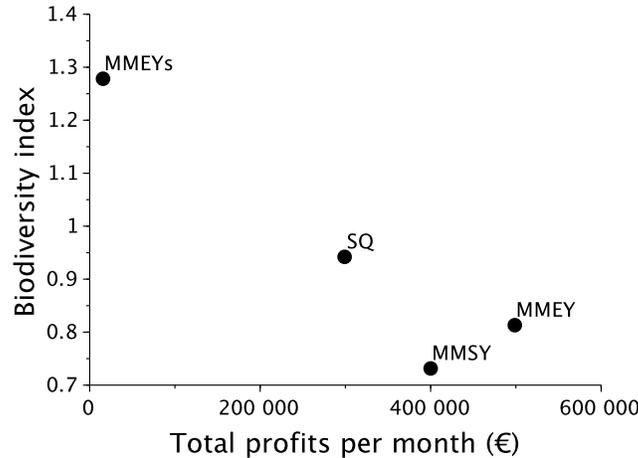


Figure 4: Ecological and economic efficiency of different harvesting policies in the coastal fishery in French Guiana. For each harvesting strategy, the Shannon index of biodiversity and the total profits per month are shown. Strategies shown are the status quo (SQ), the multispecies maximum sustainable yield (MMSY), the multispecies maximum economic yield (MMEY), and the sustainable MMEY at which no species is overharvested (MMEYs). At SQ, MMEY and MMSY, respectively two, three and four species are extinct. In the status quo case, the applied harvesting effort corresponds to the mean effort between 2006 and 2010.

## 6 Conclusion

In this paper, we address the question of optimal harvest for mixed fisheries involving technical interactions. Using a bioeconomic model of multiple species harvested by a single fleet, we derive the expression of the fishing effort that maximizes total catches (MMSY) and total profits (MMEY). These expressions are generalizations of those found by (Legović and Geček, 2010) and (Clark, 2006). Moreover, we show how the efforts at MMSY and MMEY are respectively weighted averages of monospecific efforts at MSY and MEY. The interpretation of these weighted averages allows to easily identify conditions for overharvest and extinction. These results thus provide a general framework that brings novel insights into the potentially deleterious consequences of MSY and MEY policies in mixed fisheries.

First, we show to what extent MMSY threatens low-productivity species. More pre-

373 cisely, we prove that overharvest at MMSY is induced by a combination of biological  
374 (low growth rate, high intraspecific competition) and technical (high catchabilities) pa-  
375 rameters. These general conditions concur with previous results based on more specific  
376 models (Ricker, 1958; Larkin, 1977; Legović and Geček, 2010) and can help to inter-  
377 pret results from data-based models (Guillen et al., 2013). We also show that reducing  
378 the overharvest of species at risk implies to balance growth rates with catchabilities.  
379 The idea of balancing harvest relatively to the productivities of harvested stocks has  
380 been suggested as a more sustainable alternative to the selective harvest of age-classes  
381 or species (Zhou et al., 2010; Garcia et al., 2012). However the balanced harvest-  
382 ing approach also faces criticism for lack of practical evidences and for difficulties of  
383 implementation (Froese et al., 2015; Burgess et al., 2015).

384 Second, we show that MMEY endangers low-value species. In fact, populations with  
385 low biotechnical productivity and low value are expected to have also low monospecific  
386 MEY efforts and low weight in the MMEY calculation, and thus be overharvested or  
387 even extinct at MMEY. These findings provide a general framework to understand  
388 previous results from the literature. With a model of two harvested independent pop-  
389 ulations, Clark (2010) concluded that "populations with relatively low biotechnical  
390 productivity are subject to elimination under joint harvesting conditions provided that  
391 the cost-price ratio of the other species is relatively low". A similar conclusion has been  
392 drawn by Chaudhuri (1986) with a model involving ecological interactions. Likewise,  
393 Matsuda and Abrams (2006) suggested that if two valuable species were harvested by  
394 a single fleet, the optimal effort would be driven towards the most valuable of the two.  
395 Our results also indicate that in multispecies contexts, targeting MMEY can be less  
396 sustainable than reaching MMSY, although single-species models show inverse out-  
397 comes (see for instance (Clark, 2010)). This result had been hypothesized by Guillen  
398 et al. (2013), who suggest that depending on the relative prices of the different species,  
399 the MMEY effort could also be higher than the MMSY effort, especially if the most  
400 productive species are given higher prices. Our results ascertain this conjecture and  
401 offer it an analytical foundation.

402 Third, we identify economic incentives that promote conservation at MMEY. We  
403 show that taxing highly-productive underharvested species and subsidizing lowly-productive  
404 overharvested species improves sustainability at MMEY. Landing fees have already  
405 been proved an efficient instrument for managing uncertain stocks (Weitzman, 2002).  
406 Subsidies on prices are ranked by Sumaila et al. (2010) as *capacity-enhancing*, or even  
407 *bad* subsidies, as they are supposed to increase pressure on stocks. On the contrary, our  
408 results indicate that when total profits are maximized, subsidizing low-value species can  
409 be beneficial to their stocks. In accordance with Sumaila et al. (2010), we suggest that  
410 subsidies on variable costs increase pressure on stocks, and we derive the expression of  
411 a sustainable cost that precludes overharvest at MMEY. Subsidies on variable costs are  
412 for the most part subsidies on fuel, as shown in (Sumaila et al., 2008, 2010). Phasing  
413 out fuel subsidies could thus be an efficient incentive to foster biodiversity conservation  
414 at MMEY. But as shown with our case study, this conservation measure can also yield  
415 significant economic losses to the fishery and reduce fish food supply. Such outcomes  
416 strongly question the relevance of MMSY and MMEY strategies for operationalizing  
417 the ecosystem approach to fisheries management.

418 In this study, we assumed that all species are ecologically independent, while har-  
419 vesting certain species is known to have cascading effects in trophic networks (Finnoff  
420 and Tschirhart, 2003). For instance, Voss et al. (2014) found that maximizing profits in  
421 the Baltic Sea reduces the stock of sprat below precautionary limits, due to predation  
422 by cods. However, we argue that our findings are general enough to explain results of  
423 models with ecological interactions, as for instance in (Chaudhuri, 1986; Matsuda and  
424 Abrams, 2006; Legović et al., 2010). We also considered that all species are harvested  
425 by a single fleet, while most fisheries involve multiple fleets that may interfere with  
426 each others (Ulrich et al., 2001). As shown in (Guillen et al., 2013), multiple fleets can  
427 also complement to reach more profitable and sustainable multispecies yields. Reach-  
428 ing MMSY and MMEY then requires to define an optimal allocation of efforts between  
429 fleets, that can lead to the exclusion of less efficient fleets.

430 Optimal extinction of harvested species has mainly been discussed with single-

431 species dynamic models (Clark and Munro, 1975, 1978). In line with Swanson (1994),  
432 our results suggest that even in a static framework, optimizing for multiple species  
433 can induce severe depletions in harvested ecosystems. Moreover, potential economic  
434 incentives to promote sustainability would likely incur heavy costs and reductions in  
435 landings. Overall, these results highlight the potential bioeconomic unsustainability  
436 of multispecies MSY and MEY and challenge the relevance of multispecies optimum  
437 yields in implementing an ecosystem approach to fisheries management.

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## 558 A Appendix

### 559 A.1 Proof of Proposition 7

560 Let  $p'_k = p_k + \tau_k$  be the subsidized price of species  $k$ , with  $\tau_k$  positive. Then,

$$e^{MMEY'} = \frac{1}{2} \frac{\sum_{i=1}^N r_i p_i q_i s_i^{-1} - c + r_k q_k s_k^{-1} \tau_k}{\sum_{i=1}^N p_i q_i^2 s_i^{-1} + q_k^2 s_k^{-1} \tau_k} = \frac{1}{2} \frac{\gamma + \delta \tau_k}{\rho + \phi \tau_k}, \quad (22)$$

561 with  $\gamma = \sum_{i=1}^N r_i p_i q_i s_i^{-1} - c$ ,  $\delta = r_k q_k s_k^{-1} \tau_k$ ,  $\rho = \sum_{i=1}^N p_i q_i^2 s_i^{-1}$  and  $\phi = q_k^2 s_k^{-1} \tau_k$ . The  
 562 effect of subsidy  $\tau_k$  is given by differentiating this expression relatively to  $\tau_k$ :

$$\frac{\partial(e^{MMEY'})}{\partial \tau_k} = \frac{1}{2} \frac{\delta \rho - \gamma \phi}{(\rho + \phi \tau_k)^2} \quad (23)$$

563 This derivative is negative if

$$\frac{\gamma}{\rho} > \frac{\delta}{\phi} \Leftrightarrow \frac{\sum_{i=1}^N r_i p_i q_i s_i^{-1} - c}{\sum_{i=1}^N p_i q_i^2 s_i^{-1}} > \frac{r_k}{q_k} \Leftrightarrow e^{MMEY} > e_k^{MSY}. \quad (24)$$

564 It means that if species  $k$  is overharvested at MMEY ( $e^{MMEY} > e_k^{MSY}$ ), subsidies on  
 565 species  $k$  reduce the effort at MMEY and thus improve sustainability. Likewise, by  
 566 considering that  $p'_k = p_k - \tau_k$  is the taxed price of species  $k$ , it can be found that taxing  
 567 species that are underharvested at MMEY also reduces the effort at MMEY.

### 568 A.2 Proof of Proposition 8

569 It is equivalent to proving that a vector of prices can be found that avoids over-  
 570 harvesting at MMEY. From Proposition 6, we know that if  $\forall k \in [1, \dots, N], c \geq$   
 571  $\sum_{i=1}^N \frac{p_i q_i^2}{s_i} (\frac{r_i}{q_i} - \frac{r_k}{q_k})$ , then all species are either underharvested or fully harvested at

572 MMEY. In matrix form, it is equivalent to  $MP \leq C$ , with  $P = \begin{pmatrix} p_1 \\ \vdots \\ p_N \end{pmatrix}$ ,  $C = \begin{pmatrix} c \\ \vdots \\ c \end{pmatrix}$  and

573  $M = \begin{pmatrix} 0 & \dots & \frac{q_N^2}{s_N} \left( \frac{r_N}{q_N} - \frac{r_1}{q_1} \right) \\ \vdots & \ddots & \vdots \\ \frac{q_1^2}{s_1} \left( \frac{r_1}{q_1} - \frac{r_N}{q_N} \right) & \dots & 0 \end{pmatrix}$ . Following a corollary to Farkas' lemma de-

574 scribed in (Border, 2013), only one of the following alternatives holds: either  $\exists P \in$   
 575  $\mathbb{R}^N$  so that  $MP \leq C$  and  $P \geq 0$ , or else  $\exists \mu \in \mathbb{R}^N$  so that  $\mu' M \geq 0$ ,  $\mu' C < 0$  and  $\mu > 0$   
 576 ( $\mu'$  being the transpose of vector  $\mu$ ). As  $C > 0$ , only the first alternative holds. It is  
 577 thus always possible to find a system of prices that avoids overharvesting at MMEY,  
 578 by reducing the effort at MMEY. As reducing the MMEY efforts amounts to subsidi-  
 579 zing overharvested species and taxing underharvested species (Proposition 7), it is  
 580 always possible to find a system of taxes and subsidies that precludes overharvesting  
 581 at MMEY.