

# Conservation policies informed by food system feedbacks can avoid unintended consequences

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## Abstract

1 Understanding the feedbacks between food systems and conservation policies can help avoid  
2 unintended environmental consequences. Using a survey-based choice experiment and  
3 economic modeling, we quantify the potential impact of tourists' responses to a shift in offshore  
4 fish supply after the designation of a large-scale marine protected area in Palau. We find that this  
5 conservation policy may increase offshore fish prices and tourists' consumption of reef fish,  
6 thereby further endangering local reef ecosystems. However, if tourists are offered a sustainable  
7 offshore choice, their demand for fish could be kept at current levels, and environmental impacts  
8 from increased reef fish consumption would be avoided.

## Main

9 Anticipating and avoiding unintended environmental consequences of conservation policies  
10 require careful consideration of both ecological and socio-economic effects. Without such  
11 understanding, efforts to promote conservation goals may generate fewer positive outcomes than  
12 expected or, in extreme cases, even lead to negative consequences<sup>1-4</sup>. For example, limiting  
13 resource access can shift market supply and demand, leading to price changes and consumption  
14 of substitute goods. In one illustrative case, when Pacific Northwest logging was curtailed on  
15 public land to preserve forest habitats, timber production on private properties increased around  
16 the region, significantly reducing the effectiveness of the policy<sup>1</sup>.

17 Negative environmental consequences of conservation policies can manifest through food  
18 systems<sup>5,6</sup>. For example, instituting marine protected areas (MPAs)<sup>7,8</sup> and allocating land to  
19 conservation<sup>6</sup> can generate food security concerns in a situation of resource competition with  
20 food production. Food systems can, in turn, generate feedbacks that may cause negative  
21 environmental consequences, such as poor fish supply increasing bushmeat demand<sup>9</sup>, although  
22 these are less documented<sup>9-11</sup>. To predict and, most importantly, avoid such unintended  
23 consequences, it is critical to understand the behavioral incentives created by conservation  
24 policies for affected local populations and for tourists. In this respect, tourists' food consumption  
25 behavior is often ignored in conservation policy design, even though it is an important driver of  
26 food systems, especially in developing nations<sup>12</sup>.

27 Here, we quantify the unintended ecological consequences of conservation policies being  
28 generated by tourism via food system feedbacks. In particular, we empirically investigate potential

29 unintended environmental impacts on coral reefs ecosystems generated by tourists' behavioral  
30 responses to a shift in offshore fish supply after a protected area designation. Rather than simply  
31 documenting negative consequences of conservation *ex post*, this research illustrates how  
32 unintended environmental impacts can be anticipated and avoided through assessing socio-  
33 economic behavior before a policy is implemented.

34 Our empirical analysis focuses on the new, offshore Large-Scale Marine Protected Area (LSMPA)  
35 of Palau. During the last decade, several island nations across the world designated policies for  
36 safeguarding coastal and marine areas<sup>13</sup>, with LSMPAs now being introduced in the Atlantic,  
37 Pacific, and Indian Oceans<sup>14,15</sup>. Scholars have begun to examine ecological and socioeconomic  
38 dimensions of LSMPAs<sup>2,16–18</sup> but empirical investigations of their potential unintended  
39 consequences, which assess feedback impacts from food systems and, at the same time,  
40 presents financially-viable solutions, are still lacking. Since 2001, Palau has been attracting over  
41 100,000 visitors per year, which corresponds to five times the resident population. On January 1,  
42 2020, it fully implemented the sixth largest LSMPA in the world – the Palau National Marine  
43 Sanctuary (PNMS). The PNMS legislation bans fishing and all extractive activities in 80%  
44 (500,000 km<sup>2</sup>) of Palau's offshore Exclusive Economic Zone (EEZ), and limits industrial fishing to  
45 only 18% (114,000 km<sup>2</sup>) of the remaining EEZ, the residual coastal area being available to reef  
46 and coastal fishers. One goal of the PNMS is to grow Palau's nascent domestic offshore fishery,  
47 which currently consists of a small fleet of day-boat vessels, with the ultimate intent of reducing  
48 pressure on their overexploited reef fish species<sup>19,20</sup>.

49 The first step of our approach was to identify the potential socio-economic effects of conservation  
50 policies on Palau's food systems. PNMS restrictions on industrial fishing are highly likely to  
51 significantly reduce offshore fish landings for its domestic market, which, prior to the PNMS, was  
52 dominated by foreign, industrial fleets. Such fish include tuna, wahoo, and mahi mahi, which are  
53 the main ingredients of tourists' meals in Palau<sup>21</sup>. Any shortage in offshore fish supply is expected  
54 to drive up offshore fish-based meal prices, which, in turn, may encourage tourists to increase  
55 their reef-fish consumption, intensifying pressure on local reefs. In fact, after only a couple of  
56 months since the implementation of the PNMS, supply shortages and subsequent price increases  
57 of offshore fish are already leading to increased reef-fish demand from grocery stores and  
58 restaurants<sup>22</sup>. This is noteworthy since reef fishes are the chief source of protein for the local  
59 population<sup>21</sup> and support healthy coral reefs — the main attraction drawing tourists to Palau<sup>23,24</sup>.  
60 Therefore, the PNMS has the serious likelihood of generating unintended ecological  
61 consequences by depleting critical nearshore ecosystems.

62 The second step was to quantify *ex ante* tourists' behavioral responses to food supply shortages  
63 by investigating their preferences for fish-based and non-fish-based meals (see Methods). We  
64 ran tablet-based surveys to assess tourists' fish consumption and, via a choice experiment, their  
65 meal preferences. Our results have shown that in 2017 tourists ate ~2 million meals a year and  
66 that ~26% of these meals included fish, divided roughly equally between reef and offshore  
67 (*Supplementary Table 7*). Furthermore, our choice experiment has indicated that tourists' demand  
68 functions for both offshore and reef fish are elastic and characterized by strong substitution  
69 effects. Figure 1 shows changes in fish consumption following an increase in the price of offshore

70 fish; about 80% of the drop in offshore-fish meals that follows a price increase is compensated by  
71 an increase in reef-fish meals, and other types of food (i.e., non-fish meals) comprise the other  
72 20%. Based on the number of tourists in 2017, a US\$10 increase in offshore-fish meal prices  
73 would generate a drop of 52,000 offshore-fish meals per year consumed by tourists and a  
74 simultaneous increase of more than 40,000 reef-fish meals. The trend persists as price increases,  
75 implying that demand for reef fish could escalate further if the price of offshore-fish meals  
76 balloons. In this representation, we assumed the price of reef fish to remain constant, although it  
77 is possible that, in the long run, reef-fish price will also increase due to higher demand levels (we  
78 explore the implication of such demand cross-elasticities in SI.8). Still, the feedback effect of food  
79 systems from the PNMS policies poses a concrete risk of increasing human pressure on Palau's  
80 vital reef ecosystems<sup>23</sup>.

Figure 1 – Insert here

81 While our demand analysis shows that socio-economic effects via food systems could lead to  
82 unintended environmental degradation, it also reveals that harnessing tourists' preferences may  
83 provide a solution if the right incentives are provided. In particular, tourists have a significantly  
84 higher willingness to pay (WTP) for offshore fish that is marketed as local and sustainable, i.e.  
85 sustainably caught by a Palau-based fleet. Similar fishery certifications have been widely used to  
86 provide a price premium to sustainable harvesters<sup>25</sup>. Figure 2 (panel a) shows that this WTP is  
87 particularly high for middle- and high-income tourists, who are willing to spend an extra US\$15  
88 for an offshore-fish meal which is locally and sustainably caught (see *Supplementary Information*).  
89 This price premium represents an economic opportunity for local fishers and restaurants; Palau's  
90 nascent domestic offshore fishery will require capital investments and capacity building, so  
91 capturing this WTP could improve this sector's viability while also curtailing tourists' demand for  
92 reef-fish meals.

93 Alongside this financial opportunity there are also potential environmental effects, since shifts in  
94 demand will modify fishing pressure on the reef. To investigate this issue, we simulated the  
95 changes in reef and offshore fish consumption if the price of offshore-fish meals increases by  
96 US\$10 in two different scenarios: *industrial fisheries* (IF) and *local sustainable fisheries* (LSF). As  
97 the baseline, we used prices and consumptions before the implementation of the PNMS. As figure  
98 2 (panel b) shows, in the first scenario, offshore fish is caught by foreign-owned IF that do not  
99 implement sustainable practices (i.e., current conditions), while in the second one, offshore fish  
100 is caught by a Palau-based fleet in a sustainable manner. We simulated changes for all tourists  
101 and by income levels. In line with our demand function estimates, the *IF* scenario showed a  
102 significant drop in offshore fish consumption (about 23%, corresponding to the 52,000 meals in  
103 Figure 1) and an almost equal increase in reef-fish meals due to the price increase. This effect  
104 was consistent across all income groups. On the other hand, in the *LSF* scenario we observed  
105 practically no change overall, with reef and offshore fish consumption remaining roughly the same  
106 as in the baseline, despite the price change. However, the lack of overall change in consumption  
107 masks the significant difference between income groups. Low-income tourists have low WTP for  
108 local sustainable offshore fish and, therefore, switch to reef-fish meals. This effect is compensated  
109 by the large change in consumption of middle- and high-income tourists who, despite the higher

110 price, consume more offshore fish (and less reef fish) because of their high WTP. Results suggest  
111 that a local, sustainable brand of offshore fish can bring financial opportunities, particularly if the  
112 tourism base is wealthier—Palau’s current tourism strategy<sup>26</sup>. Such branding can also create  
113 positive externalities by halting the increase in fishing pressure on Palau’s reefs that a surge in  
114 offshore fish price would otherwise generate. Nevertheless, taking into account heterogeneity in  
115 preferences across tourists is important to understand future consumption and environmental  
116 impacts, particularly if the proportion of low-income tourists will increase in the future.

Figure 2 – Insert here

117 Conservation policies such as establishing MPAs can attract more tourists (as already seen in  
118 Vietnam<sup>8</sup>, for example), yet positive outcomes can co-occur with negative ones. Our study  
119 demonstrates that the design of conservation policies should consider and aspire to anticipate  
120 food system feedbacks, including the wider implications of tourists’ behavioral responses.  
121 Policies’ indirect socio-economic effects via food systems can cause unintended environmental  
122 consequences, but when understood and harnessed in the right direction, they can also offer  
123 potential win-win solutions. In the case of Palau, implementing the PNMS alongside a market-  
124 based intervention which provides a price premium for verified sustainably- and locally-sourced  
125 offshore fish could increase income for local fishers and fish retailers. Consumers are willing to  
126 pay a price premium for fish that they know is locally and sustainably caught, but whether a  
127 domestic local fishery is able to supply enough fish at this price needs to be investigated.  
128 Moreover, credibility will depend on robust monitoring and verification programs to ensure  
129 compliance with sustainable practices.

130 Our results, though specific to Palau, are potentially applicable to other nations where tourism  
131 strongly drives food system and fish are of dietary and cultural importance. Our approach is  
132 broadly generalizable for investigating *ex ante* the interactions between conservation policies and  
133 tourists’ behavior, as well as sustainable solutions to mitigate unintended consequences of  
134 tourism-driven food systems impacts. As nations seek to meet international protected area  
135 agreements and achieve sustainable development goals through large-scale conservation  
136 actions, *ex ante* systematic analyses of socioeconomic trade-offs for food systems and  
137 preferences of both locals and tourists are crucial for sound policy.

## Methods

138 Tourist surveys (in English, Korean, Mandarin Chinese, Taiwanese and Japanese) were  
139 conducted from August 2017 to January 2018 in Palau. In total, 409 valid tablet-based responses  
140 represented the island’s tourist demographics (see *Supplementary Information*). The profile of  
141 tourists’ current fish consumption was obtained by asking respondents to report the trip duration,  
142 number of fish-based meals (i.e., breakfasts, lunches, and/or dinners) consumed in Palau by type  
143 (reef, tuna, other non-tuna offshore) and form (whole, cooked fillet, or raw). Results were  
144 reweighted in order to match the share of tourists in Palau in 2017 (see *Supplementary*  
145 *Information*) and to accommodate that ~7% of our sample reported to not eat fish. As the number

146 of fish-eating respondents were not normally distributed across all groups, a sequential hurdle  
147 model was run in the R statistical software package “glmmTMB”<sup>27</sup> to test for consumption  
148 differences across nationalities (see *Supplementary Information*).

149 The discrete choice experiment comprised credible restaurant menus with varying prices, in which  
150 respondents had to indicate their preferred meal option, using a decomposition approach<sup>28</sup>. Each  
151 menu offered four fish and one non-fish meal, which included both meat and non-meat meals  
152 and, in effect, served as the outside option<sup>29</sup>. Fish-eating respondents were presented with a  
153 random set of 12 menus. Fish-based meals included the following 11 options: reef fish (whole,  
154 fillet, or raw), tuna (raw, cooked, local-sustainable (LS) raw, or LS cooked), and non-tuna offshore  
155 fish (raw, cooked, LS raw, or LS cooked). The price of each fish-based meal varied between \$10  
156 and \$75 (see *Supplementary Information*). The menus and prices were produced using a D-  
157 efficient design.

158 The analysis of our discrete choice experiment responses follows the random utility model  
159 framework<sup>30</sup>. Therefore, tourists’ preferences are captured by the following equation:

160 (1) 
$$U_{ikj} = \alpha_j + \beta \text{price}_{ikj} + \varepsilon_{ikj},$$

161 where  $i$  indicates the respondent,  $k = 1, \dots, 12$  the choice cards and  $j$  the choice options.  $\varepsilon_{ikj}$  is the  
162 error term. The intercept  $\alpha_j$  corresponds to the difference in utility between the non-fish meal and  
163 the  $j$ -esim fish meal,  $\beta$  (which we expect to be negative) indicates the dis-utility of cost. Assuming  
164 error terms to be independent, identically distributed Gumbel random variables, the probability of  
165 choosing option  $j$  can be written in a conditional logit form and the parameters of equation (1)  
166 estimated via maximum likelihood<sup>25</sup>. Within this framework, the WTP is defined as  $-\alpha_j/\beta$  and its  
167 confidence interval can be obtained via the Krinsky and Robb approach<sup>31</sup>. This WTP can be  
168 interpreted as the additional amount respondents are willing to pay to order that specific fish dish  
169 instead of the non-fish (meat or vegetarian) option.

170 Finally, the preference parameters estimated in equation (1) can be used to simulate the demand  
171 functions for the different types of meals (see *Supplementary Information*). A debate exists on the  
172 extent of hypothetical bias affecting WTP estimates from stated preferences<sup>32</sup>. Recent findings  
173 suggest that this bias is likely to be stronger for public goods than for market goods<sup>29,33,34</sup> and,  
174 therefore, our approach should be relatively less affected by this issue. Nevertheless, in the SI.8  
175 we illustrate how our findings would change if the additional WTPs for LS fish meals would be  
176 only one half of the values we estimate in our CE.

## Data availability

177 The authors declare that all data supporting the findings of this study are available within the  
178 paper and its Supplementary Information and Data files.

## Code availability

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## **Contributions**

S.A.L., K.L.L.O., and R.D. planned the project. S.A.L., K.L.L.O., R.D., C.F., S.F and P.A.S.J. designed the study. S.A.L. K.L.L.O., R.D. and L.M. collected the surveys. C.F., S.A.L., K.L.L.O., R.D. and S.F. conducted the analysis. C.F. and S.F. designed and estimated the choice experiment analysis. S.A.L., C.F., and K.L.L.O. wrote the paper. R.D., S.F., P.A.S.J., L.M. and Y.G. contributed to the writing.

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## **Ethics declaration**

### **Competing interests**

The authors declare no competing interests.

## **Supplementary Information**

Survey Instrument, Supplementary Figures 1 – 5 and Tables 1 – 12

## **Supplementary Data**

Data and code for respondents' demographics, fish consumption, discrete choice experiment, WTP, and model estimates.