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1	Prior	itising invasive species control actions: evaluating effectiveness,
2	costs	, willingness to pay and social acceptance.
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16 Abstract

17 At a global scale, island ecosystems are recognised as high priority for biodiversity conservation, with 18 introduction of invasive species a significant threat. To investigate prioritisation of control of invasive species 19 on islands, we conducted a cost effectiveness analysis of donkey control on Bonaire, Caribbean Netherlands. To 20 be successful, prioritisation of conservation actions must take account of the ecological, economic and social 21 aspects. Further improvements may be seen where impacts can be measured across ecosystem boundaries, and 22 where management actions can be tied to funding sources. We modelled the expected ecological impacts of 23 three potential control options, estimated costs of each option, and connected this to the willingness of 24 beneficiaries to fund such projects. Finally we surveyed experts to understand the social acceptability of donkey 25 control. Of the control options, eradication is predicted to have the highest ecological impacts in both the dry-26 forest and coral reef, and to be most cost-effective over the long term. Costs of all control options were within 27 user willingness to pay. Social acceptability was highest for fencing, and lowest for lethal control. Though eradication offers the highest ecological benefits, we suggest that lower initial costs and higher social 28 29 acceptability make fencing the more appropriate choice for Bonaire in the immediate future. In this way we 30 illustrate the importance of considering economic and social impacts alongside the ecological in environmental 31 conservation, and present an integrated application for prioritising conservation policy choices. 32

33 Keywords: environmental management; cost-effectiveness analysis; invasive species; willingness to pay;

34 funding; island conservation

35 **1. Introduction**

36 Invasive species present a significant threat to ecosystems worldwide. This is particularly the case on islands, 37 where species have been isolated from competition or predation pressure, and thus are less able to withstand 38 invasions when they occur (Dawson et al., 2015; Martins et al., 2006). Understanding the impacts of invasive species and the tools available for their control is important for prioritising environmental conservation actions. 39 40 While evaluations of the cost-effectiveness and social acceptability of alternative control options are becoming 41 more widespread, studies drawing these together with potential funding mechanisms remain scarce. Given the 42 large impacts of invasive species on islands, further gains in environmental conservation may also be observed 43 where such prioritisation is able to consider impacts across ecosystem boundaries (e.g. terrestrial to marine).

44

Eradication is widely regarded as the most environmentally effective solution to control damage by invasive species (Cruz et al., 2009; Donlan et al., 2003). However high economic costs or social concerns may make eradication a less-preferable or indeed an inappropriate action. Alternatives to eradication, such as lethal (Saunders et al., 2010) and non-lethal (Reiter et al., 1999) population control, or restricting species movement, often need to be considered (Cruz et al., 2009; Donlan et al., 2002).

50

51 Prioritising actions to tackle ecological degradation caused by introduced species requires prediction of 52 environmental states both with and without action, to identify the added environmental value of proposed 53 initiatives (Maron et al., 2013). This can be challenging, partly due to the long time scales involved with 54 recovery (Shwiff et al., 2013). In addition, the highly specific spatial and temporal variation associated with 55 costs and benefits of environmental conservation (Armsworth, 2014; Balmford et al., 2003; Cullen, 2013) limits 56 the transferability of studies between locations. Invasive species control is associated with high economic costs, 57 while environmental management remains chronically underfunded (Armsworth, 2014; Boyd et al., 2015; 58 Bruner et al., 2004). Prioritisation of environmental conservation, and invasive species in general, has drawn 59 upon risk analysis (Harwood, 2000), decision analysis (Maguire, 2004), multi-criteria analysis (Liu et al., 2011; 60 Mendoza and Martins, 2006) and return on investment analysis (Boyd et al., 2015), among others, to incorporate 61 multiple uncertainties, objectives and stakeholders involved in prioritising conservation actions. However the 62 high data needs of such methods presents a barrier to many projects. As such we present here an initial step 63 towards prioritisation of conservation actions, and the analysis presented in this paper may inform the basis of a 64 more in-depth prioritisation plan. 3

66 This paper is the last in a series of papers investigating the impacts and control of invasive grazing species on the island of Bonaire in the Caribbean Netherlands (12° 10' N 68° 17' W). Previous work has modelled the 67 relationship between ecosystem characteristics and natural variation in invasive species densities, estimating a 68 69 negative relationship between grazing pressure by donkeys and vegetation ground cover (Roberts, 2017). We 70 demonstrate how these models can be utilised to estimate the impacts of alternative management strategies (in 71 this case donkey control) on ecosystem characteristics. We draw on models developed in Roberts et al 2017b, 72 which estimate a positive relationship between terrestrial vegetation and coral reef health, to illustrate the 73 impacts that invasive species control can have across ecosystem boundaries. Though estimating costs of 74 invasive species control is fraught with difficultly (de Brooke et al., 2007; Donlan and Wilcox, 2007; Martins et 75 al., 2006), inclusion of even broad cost estimates have been shown to be valuable to prioritising conservation 76 actions (Boyd et al., 2015). We therefore estimate the costs of actions and relate these to predicted 77 environmental impacts from Roberts et al 2017 & 2017b to assess the cost-effectiveness of each control option. 78 79 Conservation actions are limited by restricted funding (Bruner et al., 2004). Since the persistence of 80 conservation programs is more likely where they are self-financed (Whitelaw et al., 2014), user fees have the 81 potential to greatly improve conservation gains. As alternative conservation actions are expected to have varied 82 environmental outcomes, user willingness to pay should vary across actions. Quantifying the willingness to pay 83 of those who benefit from conservation actions, using a payment mechanism deemed acceptable by users, 84 provides valuable information for availability of funding, and therefore the long-term economic sustainability of

the project. In Roberts et al 2017a we estimated willingness to pay of SCUBA divers for control of terrestrial

86 invasive species, where this would be expected to improve reef health. In this paper we use those estimates to

87 calculate willingness of SCUBA divers to pay for the coral reef improvements predicted to arise from the

88 alternative donkey control strategies.

89

Finally, addressing social concerns has been recognised as of high importance for successful invasive species
control (Guerrero et al., 2010; McLeod et al., 2015). Failing to account for social acceptability of actions can
lead to unforeseen costs and delays, public opposition, and cancellations of management actions (Frank et al.,
2015; Lodge and Shrader-Frechette, 2003; Moon et al., 2015). We therefore present an initial overview of the

- social acceptability of each donkey control strategy, and discuss further work needed before any action can be
 implemented.
- 96

97 2. Methods

- 98 Drawing together the four criterion needed for prioritising conservation actions (conservation effectiveness
- 99 (Roberts, 2017; Roberts et al., 2017b); economic costs; willingness to pay of beneficiaries (Roberts et al.,
- 100 2017a), and social acceptance), we analyse options for invasive species control options, and make
- 101 recommendations for future management in our study site. This approach is particularly applicable to sites
- 102 where data and expertise for formal risk analysis, feeding into multi-criteria analysis, is not available. The
- 103 process followed in this paper is summarized in Fig 1.



104

Fig 1 Map to indicate relationship between vegetation, coral reef, potential diver funding and controlling ofgrazing

107

108 2.1 Study system

- 109 The island of Bonaire, Caribbean Netherlands, is a highly-regarded SCUBA diving destination, and has an
- 110 extensive marine conservation program (Steneck et al., 2015). However the island has a long history of
- 111 terrestrial degradation, as invasive goats, donkeys and pigs were introduced for farming as early as the 16th
- 112 Century (Westermann and Zonneveld, 1956). Today all three species have established feral populations (goats:
- 30,000 (Cado van der Lelij et al., 2013), donkeys: 1000 (unpublished data), pigs <1000 (unpublished data),
 6

114 whilst goats continue to be farmed, with privately-owned goats allowed to roam free alongside the feral 115 population. As a result, Bonaire's dry forest is now characterised by only a few surviving trees and by low levels of vegetation ground cover (Freitas et al., 2005). Low vegetation cover is associated to increased sediment run-116 117 off, due to reduced root systems, which otherwise anchor soils (Álvarez-Romero et al., 2011; Maina et al., 2013; 118 Mateos-Molina et al., 2015). Increased sediment levels adversely impact the coral reefs surrounding Bonaire. 119 Increased suspended sediment is associated to reduced light levels, which slows coral growth rates (Pollock et 120 al., 2014), reduces structural stability (Erftemeijer et al., 2012) and disrupts coral (Jones et al., 2015) and fish 121 (Wenger et al., 2014, 2011) development and recruitment. Nutrient levels are also increased, which promote 122 macroalgal growth and smothers hard corals (De'ath and Fabricius, 2010). Settling sediment can lead directly to 123 coral mortality, as well as restricting feeding polyps, altering coral morphology (Erftemeijer et al., 2012), 124 promoting disease (Weber et al., 2012) and disrupting fish communities (Goatley and Bellwood, 2012). Further 125 disruption to recruitment is seen as juvenile corals struggle to establish on high sediment substrates (Jones et al., 126 2015). Such damage to coral reef system decreases its attractiveness to divers. Consequently, terrestrial 127 degradation is recognised as threatening Bonaire's marine ecosystems (Slijkerman et al., 2011; Wosten, 2013), a

128 situation which is common with many other coral reef systems worldwide.

129

130 **2.2 Control options**

131 Options for mitigating the ecological damages due to over-grazing by donkeys, goats and pigs were identified

132 through communication with local stakeholders (Bonaire Island Government; Bonaire conservation

133 organisation, Echo; National Park Authority STINAPA). Three management strategies were considered:

134 1. Fencing of designated nature areas (Error! Reference source not found.);

135 2. Lethal control of feral donkey populations (reducing populations but not eliminating them);

136

3. Eradication of feral donkey populations.

137 Due to the high densities of goats recorded across the island it was not possible to model the impacts of goat

138 control, as no variation in goat grazing pressure was observable. Conversely pig densities were too low across

the island to enable modelling of pig impacts . For these reasons we have considered only donkey control withinthis study.





143 Fig 2 Bonaire Zoning Plan, showing nature areas in dark green. (Openbaar Lichaam Bonaire, 2011)

144 **2.3** Quantifying grazer impacts on vegetation health

145 Vegetation characteristics anticipated to impact reef health were identified as tree biomass and percentage 146 ground cover (Aguirre-Muñoz et al., 2008; Rojas-Sandoval et al., 2014). These characteristics were estimated within 101 quadrats of 100m², randomly located, stratified by landscape type. Due to low densities of donkeys 147 148 point counts were not possible, therefore donkey densities were estimated from transect counts, with a density index calculated from the number of donkeys observed at a given location, divided by the number of visits to 149 150 that location. Kernel density estimation was then used to extrapolate this data to create a density map across the 151 island, from which estimated density at each point could be extracted. General linear models were used to 152 estimate the relationship between donkey density and tree biomass (estimated from height and diameter, no 153 attempt to estimate belowground biomass was made) or vegetation ground cover (data log transformed). 154 Vegetation ground cover was estimated to be negatively impacted by dry season donkey density. Tree biomass 155 did not show any variation with variables modelled (Appendix A). 156

We calculated the predicted impacts on ground cover of each grazer control strategy. To calculate ground cover
 for fencing estimates were first made for median and zero donkey density. Weighted means of these estimates
 8

159 were used to calculate ground cover for fencing from zero to 41% of island area (0ha - 1,208ha, area covered by 160 nature areas which when fenced will have a donkey density of zero). Ground cover following donkey control and eradication was estimated from zero to maximum donkey density (max donkey density index = 18). 161 Estimates of ground cover if no action were taken were estimated using median donkey density. Median density 162 163 was used because grazer populations on Bonaire are well established, and therefore likely at equilibrium within 164 the ecosystem. Sensitivity of models to errors associated with the estimates was tested through repeating 165 calculations using the upper and lower 95% confidence intervals for donkey density impact. For full explanation 166 of methods and results see (Roberts, 2017).

167

168 Due to low spatial variation in both goat and pig densities we were not able to model their impacts on 169 vegetation, and therefore concentrate on donkey impacts only. This limits the outputs of our model in two ways. 170 When considering removal of multiple species, such as would be the case in fencing, we are able to estimate 171 only the benefits arising from donkey control, likely underestimating impacts. Conversely when estimating 172 impacts of donkey eradication we are not able to incorporate potential for goats or pigs to fill the niche, and may 173 therefore over estimate impacts (though that a relationship is observed between ground cover and donkey 174 density at the current goat and pig densities suggests that some reduction in grazing would be observed with the 175 removal of donkeys alone).

176

177 2.4 Quantifying vegetation impacts on coral reef health

178 Coral reef characteristics predicted to be affected by sedimentation rates were identified through a review of the 179 literature as: coral cover (at 5m and deeper than 5m) (Erftemeijer et al., 2012; Jones et al., 2015; Pollock et al., 180 2014); visibility (Mateos-Molina et al., 2015; Risk, 2014); and fish community (abundance; species richness; 181 and diversity) (Goatley and Bellwood, 2012; Wenger et al., 2014, 2011). A full explanation of methods and results can be found in Roberts et al. 2017b, and we will give only a brief overview here. Visibility and coral 182 183 cover data were mapped using citizen science data collection, with fish data collected from the REEF fish 184 database (REEF, 2016). Vegetation characteristics were measured at 101 sites across Bonaire, and average 185 vegetation ground cover and tree biomass estimated for each watershed. General linear models were then used 186 to estimate the impacts of vegetation characteristics on each of the coral reef characteristics measured. Coral 187 cover below 10m depth was the only model to show a significant relationship to watershed characteristics. A 188 positive relationship was found between coral cover and vegetation ground cover, interacting with tree biomass

to show a larger positive impact when tree biomass was high. Tree biomass showed a negative relationship to coral cover, with high impacts when ground cover was low. Coral cover was also positively impacted by distance from town and presence of a salina on the watershed, and negatively impacted by the site being shore accessible to divers, and adjacent to urban areas (Appendix B).

193

194 We estimated changes in coral cover for each grazer control option. For all calculations, tree biomass and 195 distance from urban areas were input as median values, and sites treated as shore accessible. Ground cover was 196 entered using the estimates calculated above. To enable comparison to environmental condition with no control 197 (Maron et al., 2013) coral cover was estimated using median ground cover estimates.. Due to the unbounded 198 nature of the model, estimates of coral cover arising from donkey control were estimated beyond the possible 199 range for coral cover. Cover reported in figures is restricted to between 0 and 100%. Sensitivity of the model to 200 errors associated with the estimates were tested through repeating the calculations for upper and lower 95% 201 confidence intervals of ground cover.

202

203 2.5 Economic costs and grazer control strategies

Economic costs are estimated only for material and labour involved in donkey control. Only government owned 'nature areas', covering 41% of the island (1,208ha, Error! Reference source not found.), are considered for fencing, because these are the only areas in which farming is currently prohibited, and could therefore be effectively fenced. As the donkey population is feral, reducing the population does not impose financial losses on individuals. Costs could not be calculated for loss of grazing for free ranging goats associated with the establishment of fenced areas.

210

Costs for fencing were adapted from budgets for a fencing project begun by Echo on Bonaire in 2016. This included materials, labour, transport, and administration costs. Labour and material costs were scaled up proportionally with the size of the project, whilst infrastructure and administration costs increased at 10% of proportional costs. An additional 10% was added to each budget to reflect underestimation of costs in initial budgets (S. Williams & L. Schmaltz, pers. comm.).

216

Control and eradication costs were initially estimated using costs reported in the literature. A search of Web of
 Science for: eradication and ungulate or goat or donkey or pig returned 81 relevant papers, of which six reported 10

costs (Cruz et al., 2009; Holmes et al., 2015; Martins et al., 2006; Massei et al., 2011; McCann and Garcelon,
2008; Melstrom, 2014). Costs for control were estimated using median cost per hectare, and repeated using the
lower and upper quantile.

222

223 Following communication with industry experts (Chad Henson, Island Conservation), Bonaire specific costs 224 were also calculated. Costs were estimated for a two year long program using only ground hunting (including 225 corrals and dogs), and for a 14 month long program with the additional use of helicopter for two months. Costs 226 of confirming eradication were estimated for 6, 12, and 24 month programs. Control costs were estimated as a 227 proportion of the total eradication costs. Full cost estimates can be found in Appendix D. It is important to note 228 that even when considering a single control option, variations in costs occur depending on exact design of 229 control efforts, particularly where and when actions are concentrated (Baker and Bode, 2016). Because we have 230 not considered such cost variations here the values presented should be recognised as estimates only, and a full 231 cost analysis would be needed to design the most appropriate control schedule.

232

233 2.6 Funding grazer control strategies

234 Choice experiments (Grafeld et al., 2016; Hanley et al., 2003; Train, 2009) were used to estimate the maximum 235 willingness of SCUBA divers to pay for terrestrial grazing control, where this would be expected to improve 236 reef health. Divers valued improvements in coral cover (ranging from under 25% to over 75%), visibility (25-237 100ft), and reduced fish decline (5%-35%) through an increased annual user fee. Prior to completing the survey 238 divers were provided with information cards explaining that coral in Bonaire is declining, and that sediment run-239 off is one of the causes of this decline. Cards (Appendix C) explained that one way to reduce sediment run-off 240 would be to control grazing by invasive species, though lethal control or restricting movements. Participants 241 were then asked if they would be willing to pay an increased fee in principle to fund this action, before moving 242 on to the choice experiment.

243

Within the choice experiment we did not include details of other, more direct, actions which could also improve coral cover. Bonaire already has a well established marine conservation program, the main body of which is run by STINAPA, the national park authority, and is funded by the existing dive fee of \$25. Actions funded by this fee includes a lionfish hunting program, patrols to enforce fishing restrictions, and coral reef monitoring, and therefore would continue to be funded alongside any terrestrial conservation actions. As such the willingness to 11 pay estimates presented here are applicable only to control of invasive grazing species, and cannot be used to trade off a broader set of alternative options for coral reef conservation.

251

Divers were sampled using a convenience sampling strategy, as no central record of divers exists to enable
random sampling. Divers were approached at shore-accessible dive sites, and at dive centres. Sample size was
299, with a response rate of 72%. Analysis using latent class modelling, which groups respondents into 'classes'
with similar preferences, indicated three classes in terms of preferences for coral reef improvements. We found
a positive preference for reef health improvements for the majority of respondents.

257

258 Model estimates from the latent class analysis were used to estimate willingness to pay for the improvements in 259 coral cover predicted to arise from each grazer control strategy, assuming a linear relationship between 260 willingness to pay and coral cover¹. These improvements fell within the range of attribute levels presented in the 261 choice experiment. Coral cover coefficients were divided by cost coefficients to estimate willingness to pay for 262 each percentage point improvement in coral cover. Maximum willingness to pay of divers for potential environmental improvements was calculated by multiplying this willingness to pay for a single percentage point 263 264 improvement by predicted improvements arising from each control strategy (estimated coral cover from models 265 above, minus 46% as estimated mean current coral cover) (Appendix C). For full explanation of methods and results see (Roberts et al., 2017a). 266 267 To provide insight on what financial resources this stated willingness to pay could provide for environmental 268 269 management measures, individual willingness to pay for any specific predicted environmental quality change 270 was multiplied by the number of dive tags sold annually (2015 estimate: 89,460 (Statistics Netherlands, 2015; 271 STINAPA Bonaire, 2010), minus the \$25 fee already paid to run the marine park. The current \$25 fee was 272 removed as it is already allocated to existing actions, such as marine park patrols, and therefore would not be 273 available to cover costs of donkey control. The variability in funding potential was illustrated through repeating

¹ To assess linearity in the relationship between coral cover and willingness to pay this model was also estimated using dummy variables, results present in Table 4, Appendix C. These results show a positive willingness to pay for very high coral cover in class one, and all increases in coral cover for class two. Because the willingness to pay for improved coral cover estimated from these models was higher than that estimated using the linear model, the results of the linear model are used throughout the study, as the most conservative estimate.

274 estimates using the upper and lower 95% confidence intervals of preference parameters for improvements to 275 coral cover. We note that, should the environmental improvements represented in the choice experiment actually 276 occur, then the number of dive visitors per year could easily rise: we have not tried to quantify this effect in our 277 calculations of available funding. 278 2.7 Social acceptability of control options 279 280 Though social acceptability of control options is central to selecting the most appropriate action, the potentially 281 sensitive nature of controlling grazing species on Bonaire meant that conducting such as survey without an 282 established plan for moving forward with control risked damaging future control efforts. Therefore the social 283 acceptability survey described here is designed only to provide a very broad overview of acceptability, and a full 284 survey would be required as part of any donkey management put in place. 285 286 Social acceptability of grazer control options were estimated through scores assigned by five experts in invasive 287 species control on Bonaire (Bonaire Ministry of Economic Affairs; Bonaire Department of Nature and the 288 Environment; Echo; and the lead author of this study). Experts scored each strategy, and no grazer control, for 289 social acceptability to five local stakeholders (Conservation NGO; Government; Goat farmer; Pro-donkey 290 group; and tour organisers), from 0 to 2: 291 0 - This group has no opposition to this strategy; 1 -This group has some opposition to this strategy which must be taken into account, but the project 292 293 could feasibly commence within the next 6 months; 294 2 - This group has large opposition to this strategy, which would prevent the project from beginning 295 within the next 6 months. 296 Scores for each strategy were taken as the mean. 297 3. Results 298 299 Full donkey eradication was predicted to improve median ground cover from the current estimate of 4% to 18%, 300 compared to an estimate of 14% for fencing (lower estimate: 13%; upper estimate: 15%, likely underestimate as 301 do not include impacts of excluding goats and pigs) (Fig 3). Donkey control was estimated to improve median

- 302 coral cover to 100% compared to cover of 46% estimated for median donkey density, while fencing predicted
 - 13

- 303 increases in coral cover to 85% (Fig 4). These estimates all lie within the range of ground and coral cover
- 304 recorded on Bonaire (Min ground cover = 0%, max ground cover = 75%. Min coral cover = Under 25%, max
- 305 coral cover = Over 75%). Donkey control impacts exceeded the maximum possible values for coral cover,
- 306 therefore figures present only those impacts between 0 and 100%. To account for uncertainty in model estimates
- 307 relationships were also considered using the upper and lower bounds of donkey density estimates.
- 308
- 309 The costs of fencing for the total area designated for nature (1,208ha) was estimated at \$1,120,378 (NPV, 2%
- 310 discount rate over 10 years), with an estimated lifetime of ten years before replacement.



311

Fig 3 Ground cover change with alternative grazer control measures. Left: Fencing of nature areas; Right:
Removal of donkeys. Dashed lines show estimates using lower and upper bounds of donkey densities. Median
donkey density = 3.6, max donkey density 17. Current proportion fenced <0.01.



Fig 4 Changes in coral cover with alternative grazer control strategies. Left: Fencing, Right: Donkey control.
Dashed lines show estimates using upper and lower estimates of ground cover. Median donkey density = 3.6,
max donkey density = 17. Current proportion fenced <0.01.

319 To estimate eradication costs, six papers detailing the costs of eleven eradications were identified (Holmes et al., 320 2015; Martins et al., 2006; McCann and Garcelon, 2008; Melstrom, 2014; Ramsey et al., 2009). We considered 321 only ungulate eradications, within wooded areas. Ten of the eradications were on true islands (Cruz et al., 2009; 322 Holmes et al., 2015; Martins et al., 2006; Massei et al., 2011; Melstrom, 2014), and one within a fenced area 323 (McCann and Garcelon, 2008). Eradication costs ranged from \$10/ha USD2015 (Cruz et al., 2009) to \$1,353/ha 324 USD2015 (Holmes et al., 2015) (Appendix D) For this analysis, cost estimates calculated from the median value 325 (\$118/ha), and lower and upper quantile (\$30.50/ha and \$174/ha) were used. Total eradication of donkeys (goat and pig eradications were not costed) was estimated to cost \$3.5 million (lower estimate: \$0.8m; upper estimate: 326 327 \$5.1m). For Bonaire-specific estimates, costs (NPV, 2% discount rate over 10 years) ranged from \$8.1 million 328 for eradication including two months helicopter use and six months of monitoring, to \$11.8 million for ground 329 hunting only and 24 months of monitoring (Appendix D). Given the highly context specific nature of such cost 330 estimates (de Brooke et al., 2007; Donlan and Wilcox, 2007; Martins et al., 2006), and the preference for 331 overestimating, rather than underestimating costs, we have only use the expert estimated costs for further 332 analysis. Although costs calculated in such a way do not allow for uncertainties to be quantified, in each case the 333 median cost estimates as well as the lower and upper estimates have been included, to enable comparison across 334 the range of likely costs.

335

336 From the latent class modelling results for the choice experiment undertaken with divers, mean maximum 337 willingness to pay for class one (latent class share: 0.66, Appendix C for reef recovery arising from fencing 338 (85% coral cover), when compared to predicted cover with median donkey density (46% coral cover), was 339 estimated at \$107.76/individual/year (lower bound: \$82.11/individual/year; upper bound: 340 \$128.29/individual/year). Mean maximum willingness to pay for donkey removal (for a predicted improvement 341 to 100% coral cover), was estimated at \$149.21/individual/year (lower bound: \$120.79/individual/year; upper 342 bound: \$177.00/individual/year). These estimates presume a linear relationship between willingness to pay and 343 coral cover, following visual assessment of the results. Estimates have not been extrapolated beyond the levels 344 presented within the survey. It is estimated 89,460 dive tags were sold in 2015, when this is multiplied by 345 individual willingness to pay for improvements seen with fencing, funds raised (NPV, 2% discount rate over 10 years) are estimated at \$8,832,588 (\$6,730,176 - \$10,515,337), exceeding estimated costs of fencing. Funds 346 347 raised for donkey control across divers was estimated at \$12,230,053 (\$9,900,597 - \$14,507,870), exceeding the costs of full eradication. To account for uncertainties within these estimates we also include the lower and upper 348 349 bounds, with the estimated willingness to pay from the lower bound exceeding the cost of fencing, but being 350 lower by ~\$2 million for the highest estimated cost of eradication (Fig 5).





Fig 5 Estimated income from a user fee on divers for increasing levels of coral cover (line), related to costs of alternative conservation measures, and their predicted impacts on coral cover (points). Solid line shows mean willingness to pay, whilst dotted lines show higher and lower confidence intervals of the coral coefficient, as estimated from the choice experiment. Circle = fencing, square = donkey eradication. Filled symbols represent mean cost estimates, with empty symbols representing upper (ground hunting and 24 months' monitoring) and lower cost (helicopter and ground hunting, and six months' monitoring) estimates. Note the points and lines represent different data, and are not dependent on one another.

360 Fencing of nature areas had a mean social acceptability score of 0.52 (SE= 0.12, 0= fully acceptable,

361 2=unacceptable), while donkey control had a score of 0.95 (SE= 0.14). Taking no action had a mean score of

362 0.72 (SE=0.15). All options, including no action, received a score of 2 for at least one stakeholder from at least
 363 one expert.

364

365 **4. Discussion**

Using the island of Bonaire as a case study, we demonstrate the incorporation of ecological, economic and social domains for prioritising conservation actions for donkey control. Though eradication provides the largest ecological benefits, initial assessments suggest that lethal control is unlikely to be successful due to resistance by local stakeholders. Incorporation of economic costs shows that, in the short term, control of donkeys through exclusion areas created through fencing is most cost effective and is covered by the lowest estimate of diver willingness to pay. However, within 30 to 50 years, eradication would be more cost-effective, when considering only impacts from donkey control, though these costs exceed the lowest estimates of funds from a diver fee.

373

374 Including these four strands (conservation effectiveness; economic costs; willingness to pay of beneficiaries, 375 and social acceptance) into decision making we can make the recommendation for fencing of nature areas as a 376 short-term program for donkey control on Bonaire. Long term donkey control will require undertaking a full 377 social program, including a full survey to understand social barriers, and working to improve social acceptability 378 of lethal control. Considered from only an ecological standpoint this action would appear to have lower 379 ecological impacts while from an economic standpoint it is also less cost effective than eradication over the long 380 term. However though we were able to only broadly assess social acceptability of actions, the results from our 381 expert survey indicate that eradication would have a low chance of success, and therefore in reality likely result 382 in less ecological improvement. The incorporation of a user fee illustrates that a funding mechanism for such a 383 program exists, which improves the potential for planning to move into action, and for the program to be 384 sustained over the long term (Whitelaw et al., 2014).

385

When considering this recommendation for fencing it is important to note that our calculations consider only those impacts from donkey control, the additional benefits of excluding goats and pigs which would arise from fencing are not estimated. This is due to a limitation in the models used to estimate grazer impacts on vegetation, which relies on natural spatial variation to estimate impacts on vegetation. Though our models do estimate donkey impacts in the presence of goats and pigs, suggesting therefore that some additive impact is

391 present (areas with no donkeys have higher ground vegetation cover despite the presence of goats and pigs), we
392 are not able to consider the interactions of the three grazing species. With this in mind our estimates of the
393 impacts of eradication may be overestimated, as we cannot account for increased grazing by goats or pigs.
394 Fencing would therefore also present the opportunity to further refine our understanding of the impacts of
395 grazing species on Bonaire, to inform future control actions. Additionally fencing will provide the opportunity
396 to identify any unexpected ecosystem responses from removal of grazers, such as increases in invasive plant
397 species, and enable plans to be put into place to address such issues prior to further eradication or control.

398

Further limitations of our models are also apparent when considering the estimated improvements from donkey control, which are estimated to exceed 100%. This illustrates the importance of considering such models as guidelines only, and the challenges of estimating models in situ, with multiple interacting factors. Though we are confident larger improvements would be observed with donkey control than fencing, continued monitoring would be needed to refine estimates of true improvements to coral cover.

404

405 Though it is suggested that inclusion of even rough cost estimates greatly improves prioritisation of 406 conservation actions (Boyd et al., 2015), prioritisation remains highly problematic due to the scarcity of 407 reporting of eradication costs. We identified only six studies, reporting the costs of eleven ungulate eradications 408 (Cruz et al., 2009; Holmes et al., 2015; Martins et al., 2006; Massei et al., 2011; McCann and Garcelon, 2008; 409 Melstrom, 2014), with further challenges presented due to lack of reporting on time scales; habitat types; or 410 number of individuals removed. Martins et al. (2006) identify island area and taxon group as significant in 411 determining eradication costs. Median island area in studies considered was 5,683ha (500ha - 464,000ha), 412 compared to Bonaire size 2,940ha. Larger islands are predicted to have lower per ha costs (Martins et al., 2006), 413 therefore costs reported here may underestimate eradication costs for Bonaire. This is supported by expert 414 estimation of costs, which estimated costs between \$8,773,831 to \$12,968,945 for full donkey eradication on 415 Bonaire, more than twice that estimated from the literature. Such differences indicate the importance of 416 estimating costs in the local context, as well supported within the literature (de Brooke et al., 2007; Donlan and 417 Wilcox, 2007; Martins et al., 2006). While these costs are valuable for initial prioritisation they refer to broad 418 costs for hypothetical projects, that is they do not take account of variations in spatial and temporal design of 419 control actions, which are known to impact cost-effectiveness of invasive species control (Baker and Bode, 420 2016). Further refinement of these costs would therefore be valuable to design any final control program.

421

422 Willingness to pay for grazer control actions to improve reef health was positive for the majority of divers 423 responding to our choice experiment study, and exceeded the estimated costs of fencing and donkey eradication. 424 However a minority of divers were not willing to pay an increased fee for reef health improvements achieved 425 through terrestrial conservation, and therefore the risk of pushing these divers to alternative locations (and thus 426 losing their expenditures on the island) must be considered when increasing fees on all divers. One response to 427 this diversity in willingness to pay for conservation policy is to differentiate user fees according to variations in 428 preferences. Despite the shore accessibility of Bonaire's dive site preventing the setting of site-specific fees, 429 lower fee options could be offered for a restricted numbers of dives, or for family groups. Though it is useful to 430 account for preference variations, analysis also indicates that those divers with a the highest positive 431 willingness to pay are those most likely to return within the next five years. In calculating total funds raised no 432 account has been made of increases in visitors arising from improved coral cover. Divers lost through increased 433 fees may therefore have little impact on overall diver numbers, and thus on local incomes. Our survey also only 434 considered willingness to pay for coral reef improvements arising from terrestrial grazing control. Willingness 435 to pay for improvements arising from other actions, such as reducing diver numbers or putting restrictions on 436 cruise ships, may therefore vary. Such actions would also be expected to have a more direct impact on the coral 437 reef, and therefore preferences between actions should be considered where coral reef improvements are the sole 438 project aim.

439

440 Our study considered only broad understanding of the social acceptability of donkey control, as the sensitive 441 nature of control meant that a full social survey would have been detrimental to future conservation work. 442 However, even at this broad level, considering only expert opinion, it is apparent that lethal control would be 443 precluded by social opposition at this time. The higher social acceptability and lower costs of fencing, despite 444 consequent lower levels of ecological improvement, indicate that fencing of nature areas presents the best option 445 for coral reef restoration through donkey control on Bonaire in the immediate future. However, it is important to 446 note that fencing is expected to have a life of only ten years, compared to indefinite length of control for donkey 447 eradication. Within 30 to 50 years, therefore, eradication becomes the most cost-effective option. Long term 448 donkey control on Bonaire would therefore benefit from increased understanding of the social barriers present 449 for lethal control, and targeted campaigns to improve acceptability for such programs. Further gains would be 450 seen with additional studies to understand the impacts of goats and pigs. Finally the models presented here and

451 in Roberts et al 2017, 2017a and 2017b are based on the current ecological state of the system, and contain 452 inherent uncertainty surrounding the ecological, economic, and social data. Throughout data analysis and modelling upper and lower bounds of estimates have been incorporated, and for the recommended action of 453 fencing highest costs and lowest ecological outcomes still fall within the lowest willingness to pay of divers, 454 455 suggesting that even under the least favourable outcome, fencing remains a viable option for control donkey populations on Bonaire. However given the dynamic nature of ecosystem restoration, particularly when working 456 457 across ecosystem boundaries, as well as the impact this has on consumer preferences, the management 458 recommendations are suitable only for near-term decision making. For effective management of grazing species 459 on Bonaire management, plans should be updated with changing situations as control actions are rolled out over 460 time.

461

462 **5. Conclusions**

463 Prioritisation of conservation actions is vital in achieving conservation goals. Previous studies have highlighted that ecological outcomes of conservation can be improved through considering impacts across ecosystem 464 465 boundaries (Klein et al., 2014; Maina et al., 2013; Mateos-Molina et al., 2015), accounting for economic costs (Boyd et al., 2015), considering social concerns (Guerrero et al., 2010; McLeod et al., 2015), and become self-466 467 financing (Whitelaw et al., 2014). Here we have illustrated an integrated application for considering all of these 468 issues, in the context of donkey control on an island. While ecological outcomes are central to environmental conservation, the option with the highest potential for ecological success is only optimum as long as it is cost 469 470 effective, socially acceptable, and connected to funding. Achieving significant gains in biodiversity conservation 471 requires that decision makers are able to incorporate all of these considerations into prioritisation of alternative 472 actions.

473

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- 485

486 **6. References**

- 487 Aguirre-Muñoz, A., Croll, D. a, Donlan, C.J., Henry, R.W., Hermosillo, M.A., Howald, G.R., Keitt, B.S., Luna-
- 488 Mendoza, L., Rodríguez-Malagón, M., Salas-Flores, L.M., Samaniego-Herrera, A., Sanchez-Pacheco, J.A.,
- 489 Sheppard, J., Tershy, B.R., Toro-Benito, J., Wolf, S., Wood, B., 2008. High-impact conservation: invasive
- 490 mammal eradications from the islands of western México. Ambio 37, 101–107.
- 491 https://doi.org/10.1579/0044-7447(2008)37{[]101:HCIMEF]2.0.CO;2
- 492 Álvarez-Romero, J.G., Pressey, R.L., Ban, N.C., Vance-Borland, K., Willer, C., Klein, C.J., Gaines, S.D., 2011.
- 493 Integrated Land-Sea Conservation Planning: The Missing Links. Annu. Rev. Ecol. Evol. Syst. 42, 381–409.
- 494 https://doi.org/10.1146/annurev-ecolsys-102209-144702
- 495 Armsworth, P.R., 2014. Inclusion of costs in conservation planning depends on limited datasets and hopeful
- 496 assumptions. Ann. N. Y. Acad. Sci. 1322, 61–76. https://doi.org/10.1111/nyas.12455
- 497 Baker, C.M., Bode, M., 2016. Placing invasive species management in a spatiotemporal context. Ecol. Appl. 26,
- 498 712–725. https://doi.org/10.1890/15-0095/suppinfo
- 499 Balmford, A., Gaston, K.J., Blyth, S., James, A., Kapos, V., 2003. Global variation in terrestrial conservation
- 500 costs, conservation benefits, and unmet conservation needs. Proc. Natl. Acad. Sci. U. S. A. 100, 1046–
- 501 1050. https://doi.org/10.1073/pnas.0236945100
- 502 Boyd, J., Epanchin-Niell, R., Siikamäki, J., 2015. Conservation planning: A review of return on investment
- 503 analysis. Rev. Environ. Econ. Policy 9, 23–42. https://doi.org/10.1093/reep/reu014
- 504 Bruner, A.G., Gullison, R.E., Balmford, A., 2004. Financial Costs and Shortfalls of Managing and Expanding
- 505 Protected-Area Systems in Developing Countries. Bioscience 54, 1119. https://doi.org/10.1641/0006-
- 506 3568(2004)054[1119:FCASOM]2.0.CO;2
- 507 Cado van der Lelij, J.A., van Beukering, P.J.H., Muresan, L., Zambrano Cortes, D., Wolfs, E., Schep, S., 2013. The
 - 22

- 508 total economic value of nature on Bonaire 84.
- 509 Cruz, F., Carrion, V., Campbell, K.J., Lavoie, C., Donlan, C.J., 2009. Bio-Economics of Large-Scale Eradication of
- 510 Feral Goats From Santiago Island, Galápagos. J. Wildl. Manage. 73, 191–200.
- 511 https://doi.org/10.2193/2007-551
- 512 Cullen, R., 2013. Biodiversity protection prioritisation: a 25 year review. Wildl. Res. 40, 108–116.
- 513 Dawson, J., Oppel, S., Cuthbert, R.J., Holmes, N., Bird, J.P., Butchart, S.H.M., Spatz, D.R., Tershy, B., 2015.
- 514 Prioritizing islands for the eradication of invasive vertebrates in the United Kingdom overseas territories.
- 515 Conserv. Biol. 29, 143–153. https://doi.org/10.1111/cobi.12347
- 516 de Brooke, M.L., Hilton, G.M., Martins, T.L.F., 2007. The complexities of costing eradications: A reply to Donlan
- 517 & Wilcox [2]. Anim. Conserv. 10, 157–158. https://doi.org/10.1111/j.1469-1795.2007.00107.x
- 518 De'ath, G., Fabricius, K., 2010. Water quality as a regional driver of coral biodiversity and macroalgae on the
- 519 Great Barrier Reef. Ecol. Appl. 20, 840–850.
- Donlan, C.J., Tershy, B.R., Campbell, K., Cruz, F., 2003. Research for Requiems: The need for more collaborative
 action in eradication of invasive species. Conserv. Biol. 17, 1850–1851.
- 522 Donlan, C.J., Tershy, B.R., Croll, D.A., 2002. Islands and introduced herbivores: Conservation action as
- 523 ecosystem experimentation. J. Appl. Ecol. 39, 235–246. https://doi.org/10.1046/j.1365-
- 524 2664.2002.00710.x
- 525 Donlan, C.J., Wilcox, C., 2007. Complexities of costing eradications [1]. Anim. Conserv. 10, 154–156.
- 526 https://doi.org/10.1111/j.1469-1795.2007.00101.x
- 527 Erftemeijer, P.L.A., Riegl, B., Hoeksema, B.W., Todd, P.A., 2012. Environmental impacts of dredging and other
- 528 sediment disturbances on corals: A review. Mar. Pollut. Bull. 64, 1737–1765.
- 529 https://doi.org/10.1016/j.marpolbul.2012.05.008
- 530 Frank, B., Monaco, A., Bath, A.J., 2015. Beyond standard wildlife management: a pathway to encompass
- 531 human dimension findings in wild boar management. Eur. J. Wildl. Res. 61, 723–730.
- 532 https://doi.org/10.1007/s10344-015-0948-y
- 533 Freitas, J. a De, Nijhof, B.S.J., Rojer, a C., Debrot, a O., 2005. Landscape Ecological Vegetation Map of Bonaire.
- 534 Goatley, C.H.R., Bellwood, D.R., 2012. Sediment suppresses herbivory across a coral reef depth gradient. Biol.
- 535 Lett. 8, 1016–1018. https://doi.org/10.1098/rsbl.2012.0770

- 536 Grafeld, S., Oleson, K., Barnes, M., Peng, M., Chan, C., Weijerman, M., 2016. Divers' willingness to pay for
- 537 improved coral reef conditions in Guam: An untapped source of funding for management and
- 538 conservation? Ecol. Econ. 128, 202–213. https://doi.org/10.1016/j.ecolecon.2016.05.005
- 539 Guerrero, A.M., Knight, A.T., Grantham, H.S., Cowling, R.M., Wilson, K.A., 2010. Predicting willingness-to-sell
- 540 and its utility for assessing conservation opportunity for expanding protected area networks. Conserv.
- 541 Lett. 3, 332–339. https://doi.org/10.1111/j.1755-263X.2010.00116.x
- 542 Hanley, N., MacMillan, D., Patterson, I., Wright, R.E., 2003. Economics and the design of nature conservation
- 543 policy: a case study of wild goose conservation in Scotland using choice experiments. Anim. Conserv. 6,

544 123–129. https://doi.org/10.1017/S1367943003003160

- 545 Harwood, J., 2000. Risk assessment and decision analysis in conservation. Biol. Conserv. 95, 219–226.
- 546 https://doi.org/10.1016/S0006-3207(00)00036-7
- 547 Holmes, N.D., Campbell, K.J., Keitt, B.S., Griffiths, R., Beek, J., Donlan, C.J., Broome, K.G., 2015. Reporting costs
- 548
 for invasive vertebrate eradications. Biol. Invasions 17, 2913–2925. https://doi.org/10.1007/s10530-015

 549
 0920-5
- Jones, R., Ricardo, G.F., Negri, A.P., 2015. Effects of sediments on the reproductive cycle of corals. Mar. Pollut.

551 Bull. 100, 13–33. https://doi.org/10.1016/j.marpolbul.2015.08.021

- 552 Klein, C.J., Jupiter, S.D., Watts, M., Possingham, H.P., 2014. Evaluating the influence of candidate terrestrial
- 553 protected areas on coral reef condition in Fiji. Mar. Policy 44, 360–365.
- 554 https://doi.org/10.1016/j.marpol.2013.10.001
- 555 Liu, S., Sheppard, A., Kriticos, D., Cook, D., 2011. Incorporating uncertainty and social values in managing
- invasive alien species: A deliberative multi-criteria evaluation approach. Biol. Invasions 13, 2323–2337.
- 557 https://doi.org/10.1007/s10530-011-0045-4
- 558 Lodge, D.M., Shrader-Frechette, K., 2003. Nonindigenous species: Ecological explanation, environmental
- 559 ethics, and public policy. Conserv. Biol. 17, 31–37. https://doi.org/10.1046/j.1523-1739.2003.02366.x
- 560 Maguire, L.A., 2004. What can decision analysis do for invasive species management? Risk Anal. an Off. Publ.
- 561 Soc. Risk Anal. 24, 859–68. https://doi.org/10.1111/j.0272-4332.2004.00484.x
- 562 Maina, J., de Moel, H., Zinke, J., Madin, J., McClanahan, T., Vermaat, J.E., 2013. Human deforestation
- 563 outweighs future climate change impacts of sedimentation on coral reefs. Nat. Commun. 4, 1–7.

- 564 https://doi.org/10.1038/ncomms2986
- 565 Maron, M., Rhodes, J.R., Gibbons, P., 2013. Calculating the benefit of conservation actions. Conserv. Lett. 6,
- 566 359–367. https://doi.org/10.1111/conl.12007
- 567 Martins, T.L.F., Brooke, M. de L., Hilton, G.M., Farnsworth, S., Gould, J., Pain, D.J., 2006. Costing eradications of
- alien mammals from islands. Anim. Conserv. 9, 439–444. https://doi.org/10.1111/j.1469-
- 569 1795.2006.00058.x
- 570 Massei, G., Roy, S., Bunting, R., 2011. Too many hogs? A review of methods to mitigate impact by wild boar 571 and feralhogs. Human-Wildlife Interact. 5, 79–99.
- 572 Mateos-Molina, D., Palma, M., Ruiz-Valentín, I., Panagos, P., García-Charton, J.A., Ponti, M., 2015. Assessing
- 573 consequences of land cover changes on sediment deliveries to coastal waters at regional level over the
- 574 last two decades in the northwestern Mediterranean Sea. Ocean Coast. Manag. 116, 435–442.
- 575 https://doi.org/10.1016/j.ocecoaman.2015.09.003
- 576 McCann, B.E., Garcelon, D.K., 2008. Eradication of Feral Pigs From Pinnacles National Monument. J. Wildl.
- 577 Manage. 72, 1287–1295. https://doi.org/10.2193/2007-164
- 578 McLeod, L.J., Hine, D.W., Please, P.M., Driver, A.B., 2015. Applying behavioral theories to invasive animal
- 579 management: Towards an integrated framework. J. Environ. Manage. 161, 63–71.
- 580 https://doi.org/10.1016/j.jenvman.2015.06.048
- 581 Melstrom, R.T., 2014. Managing apparent competition between the feral pigs and native foxes of Santa Cruz
- 582 Island. Ecol. Econ. 107, 157–162. https://doi.org/10.1016/j.ecolecon.2014.07.004
- 583 Mendoza, G.A., Martins, H., 2006. Multi-criteria decision analysis in natural resource management: A critical
- 584 review of methods and new modelling paradigms. For. Ecol. Manage. 230, 1–22.
- 585 https://doi.org/10.1016/j.foreco.2006.03.023
- Moon, K., Blackman, D.A., Brewer, T.D., 2015. Understanding and integrating knowledge to improve invasive
 species management. Biol. Invasions 17, 2675–2689. https://doi.org/10.1007/s10530-015-0904-5
- 588 Pollock, F.J., Lamb, J.B., Field, S.N., Heron, S.F., Schaffelke, B., Shedrawi, G., Bourne, D.G., Willis, B.L., 2014.
- 589 Sediment and turbidity associated with offshore dredging increase coral disease prevalence on nearby
- 590 reefs. PLoS One 9. https://doi.org/10.1371/journal.pone.0102498
- 591 Ramsey, D.S.L., Parkes, J., Morrison, S. a, 2009. Quantifying eradication success: the removal of feral pigs from
 - 25

592 Santa Cruz Island, California. Conserv. Biol. 23, 449–459. https://doi.org/10.1111/j.1523-

593 1739.2008.01119.x

- REEF, 2016. Reef Environmental Education Foundation Volunteer Survey Project Database [WWW Document].
 URL www.REEF.org
- 596 Reiter, D.K.D., Brunson, M.W., Schmidt, R.H.R., 1999. Public attitudes toward wildlife damage management
- 597 and policy. Wildl. Soc. Bull. 27, 746–758.
- 598 Risk, M.J., 2014. Assessing the effects of sediments and nutrients on coral reefs. Curr. Opin. Environ. Sustain. 7,
- 599 108–117. https://doi.org/10.1016/j.cosust.2014.01.003
- 600 Roberts, M., 2017. Environmental Conservation Across Ecosystem Boundaries: Connecting Management and
- 601 Funding. University of St Andrews. https://doi.org/10023/12052
- 602 Roberts, M., Hanley, N., Cresswell, W., 2017a. User fees across ecosystem boundaries: Are SCUBA divers
- 603 willing to pay for terrestrial biodiversity conservation? J. Environ. Manage. 200, 53–59.
- 604 https://doi.org/10.1016/j.jenvman.2017.05.070
- Roberts, M., Hanley, N., Williams, S., Cresswell, W., 2017b. Terrestrial degradation impacts on coral reef
- 606 health: Evidence from the Caribbean. Ocean Coast. Manag.
- 607 Rojas-Sandoval, J., Meléndez-Ackerman, E.J., Fumero-Cabán, J., García-Bermúdez, M.A., Sustache, J., Aragón,
- 608 S., Morales, M., Fernández, D.S., 2014. Effects of hurricane disturbance and feral goat herbivory on the
- structure of a Caribbean dry forest. J. Veg. Sci. 25, 1069–1077. https://doi.org/10.1111/jvs.12160
- 610 Saunders, G., Cooke, B., McColl, K., Shine, R., Peacock, T., 2010. Modern approaches for the biological control
- 611 of vertebrate pests: An Australian perspective. Biol. Control 52, 288–295.
- 612 https://doi.org/10.1016/j.biocontrol.2009.06.014
- 613 Shwiff, S.A., Anderson, A., Cullen, R., White, P.C.L., Shwiff, S.S., 2013. Assignment of measurable costs and
- benefits to wildlife conservation projects. Wildl. Res. 134–141.
- 615 Slijkerman, D., Peachey, R., Hausmann, P., Meesters, H., 2011. Eutrophication status of Lac, Bonaire, Dutch
- 616 Caribbean Including proposals for measures. Rep. to Dutch Minsitry Econ. Aff. https://doi.org/CO93/11
- 617 Statistics Netherlands, 2015. Trends in the Caribbean Netherlands 2015. The Hague.
- 618 Steneck, R.S., Arnold, S.N., de León, R., Rasher, 2015. Status and trends of Bonaire's coral reefs in 2015: Slow
- 619 but steady signs of resilience.

- 620 STINAPA Bonaire, 2010. Annual Report 2010.
- 621 Train, K., 2009. Discrete Choice Methods With Simulation. Cambridge University Press, New York, NY.
- 622 Weber, M., de Beer, D., Lott, C., Polerecky, L., Kohls, K., Abed, R.M.M., Ferdelman, T.G., Fabricius, K.E., 2012.
- 623 Mechanisms of damage to corals exposed to sedimentation. Proc. Natl. Acad. Sci. 109, E1558–E1567.
- 624 https://doi.org/10.1073/pnas.1100715109
- 625 Wenger, A.S., Johansen, J.L., Jones, G.P., 2011. Suspended sediment impairs habitat choice and chemosensory
- discrimination in two coral reef fishes. Coral Reefs 30, 879–887. https://doi.org/10.1007/s00338-011-
- 627 0773-z
- Wenger, A.S., McCormick, M.I., Endo, G.G.K., McLeod, I.M., Kroon, F.J., Jones, G.P., 2014. Suspended sediment
- 629 prolongs larval development in a coral reef fish. J. Exp. Biol. 217, 1122–1128.
- 630 https://doi.org/10.1242/jeb.094409
- 631 Westermann, J., Zonneveld, J., 1956. Photo-Geological Observations and Land Capability and Land Use Survey
- 632 of the Island of Bonaire. Royal Tropical Institue.
- 633 Whitelaw, P.A., King, B.E.M., Tolkach, D., 2014. Protected areas, conservation and tourism financing the
- 634 sustainable dream. J. Sustain. Tour. 22, 584–603. https://doi.org/10.1080/09669582.2013.873445
- 635 Wosten, J., 2013. Ecological rehabilitation of Lac Bonaire by wise management of water and sediments.
- 636 ALTERRA Wagnenigen Universiity.
- 637

638 Appendix A

639 Table 1 Results from General Linear Model (log transformed data) investigating effects of grazing on

640 ground cover. The full model (ground cover ~ goat density + dry season donkey density + wet season

641 donkey density + pig presence + land use + landscape type + soil + goat density: dry season donkey

642 density + goat density: wet season donkey density + wet season donkey density: dry season donkey

643 density, n=86) is presented alongside the representative model (ground cover ~ goat density + dry season

644 donkey density + landscape type + soil class, n=86). Full model deviance = 110.8, df=68, representative

645 model deviance = 128.8, df=78. Full model intercept set to landscape type: higher terrace; soil type: sand

- and land use: agriculture. Best model intercept set to landscape type: higher terrace; soil type: sand.
- 647 Values log transformed.

Ground cover								
Full model AIC = 303.8			Representative model AIC = 296.8					
	Est.	SE	t	Ρ	Est.	SE	t	Р
(Intercept)	1.79	1.03	1.73	0.09	3.00	0.67	4.48	<0.01
Goat density	-501.99	316.39	-1.59	0.12				
Dry season donkey								
density	-0.12	0.10	-1.18	0.24	-0.15	0.06	-2.61	0.01
Wet season donkey								
density	0.06	0.12	0.51	0.61				
Pig presence	-0.40	0.48	-0.83	0.41				
Nature area	1.10	0.51	2.14	0.04				
National Park	0.85	0.74	1.16	0.25				
Open use area	0.97	0.58	1.67	0.10				
Urban use area	-0.67	1.33	-0.50	0.62				
Lower terrace	-1.28	0.77	-1.66	0.10	-1.28	0.65	-1.96	0.05
Middle terrace	0.00	0.64	0.00	1.00	-0.46	0.57	-0.81	0.42
Undulating landscape	-0.30	0.64	-0.48	0.63	-0.95	0.49	-1.95	0.05

Loam soil	-0.35	0.58	-0.60	0.55	-0.47	0.53	-0.89	0.38
Rocky soil	0.27	0.62	0.44	0.66	0.36	0.56	0.64	0.52
Terraced soil	0.87	0.62	1.40	0.17	1.25	0.58	2.14	0.04
Goat density : Dry								
season donkey density	164.62	138.61	1.19	0.24				
Goat density : Wet								
season donkey density	-45.19	82.13	-0.55	0.58				
Dry season donkey								
density: Wet season								
donkey density	0.00	0.02	-0.10	0.92				

650 Appendix B

- Table 2 Results from General Linear Model investigating effects of watershed vegetation on mean coral
- 652 cover deeper than 5m. n=49. Full model deviance = 17.39, df=37, representative model deviance = 19.08,
- 653 df=41. Intercept for full model set to soil type: loam; shore access: no; salina: no' land use: nature.
- 654 Representative model: shore access: no; land use: nature. Significant terms in bold. Table from (Roberts
- 655 et al., 2017b)

	Full Model					Representative Model			
		AIC: 114.3				AIC: 110.85			
	Est.	SE	t	Р	Est.	SE	t	Р	
Intercept	4.85	1.25	3.88	<0.01	3.09	0.44	6.99	<0.01	
Tree biomass index	-1.43	0.41	-3.53	<0.01	-0.77	0.15	-5.21	<0.01	
Percentage ground cover	-0.02	0.02	-1.33	0.19	0.00	0.01	-0.27	0.79	
Shore accessible	-0.73	0.32	-2.27	0.03	-0.71	0.30	-2.35	0.02	
Distance from town	0.63 x10 ⁻⁴	0.26 x10 ⁻⁴	2.47	0.02	0.66 x10 ⁻⁴	0.23 x10 ⁻⁴	2.84	0.01	
Rocky soil	-1.67	0.91	-1.83	0.07					
Terrace soil	-1.73	1.14	-1.51	0.14					
Terrace/rocky soils	-2.00	1.41	-1.42	0.17					
Salina present	1.50	0.83	1.81	0.08	0.78	0.46	1.70	0.10	
Slope	2.14	7.19	0.30	0.77					
Urban use	-1.88	1.68	-1.12	0.27	-1.06	0.53	-2.00	0.05	
Tree biomass index :	0.11	0.03	3.51	<0.01	0.06	0.01	5.21	<0.01	
percentage ground cover									



Percentage ground cover

657

Fig 6. Change in deep coral cover with ground cover showing how this relationship was dependent on tree
biomass. Dashed – Median tree biomass; Solid – Min tree biomass. Estimates with maximum tree
biomass are not presented as these are not representative of the majority of locations on Bonaire. Dotted
lines indicate upper and lower confidence intervals of ground cover impact. Originally presented in
(Roberts et al., 2017b)

664 Appendix C

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666
$$WTP = \left(\left(\frac{\beta_{Vis}}{\beta_{cost}}\right) \times \Delta Vis\right) + \left(\left(\frac{\beta_{coral}}{\beta_{cost}}\right) \times \Delta Coral\right) + \left(\left(\frac{\beta_{Fish}}{\beta_{cost}}\right) \times \Delta Fish\right)$$

667

 $\beta_{Vis} = Visibility \text{ preference coefficient (Table)}$

 $\beta_{Coral} = Coral preference coefficient (Table)$

670 β_{Fish} = Fish preference coefficient (Table)

- 671 β_{Cost} = Cost preference coefficient (Table)
- $\Delta Vis = Change in visibility/m$
- $\Delta Coral = Percentage change in coral cover$
- Δ Fish = Percentage change in fish abundance
- 675 Table 3 Results from latent class logit model on choice experiment data for SCUBA divers valuing coral

676 reef attributes. Significant results in bold. This table has been summarised from data originally reported

677 in Roberts et al. 2017a

	Class 1		Class 2		Class 3	
	Coef.	SE	Coef.	SE	Coef.	SE
Visibility	0.023	0.003	0.021	0.005	0.032	0.034
Coral cover	0.021	0.002	0.018	0.004	0.040	0.028
Reduced fish decline	0.027	0.005	0.002	0.009	-0.063	0.056
Cost	-0.007	0.003	-0.058	0.005	-0.141	0.081
Status quo	-3.04	0.5	-2.31	0.30	2.91	0.81
Return within 5 years	1.5		1.7		-	
Class share	0.65		0.20		0.16	

679 Table 4 Results from latent class logit model on choice experiment data for SCUBA divers valuing coral

	Class 1		Class 2		Class 3	
	Coef.	SE	Coef.	SE	Coef.	SE
Visibility	0.02	0.003	0.02	0.005	0.03	0.04
Coral cover - Mid	-0.28	0.59	1.03	0.48	0.69	1.53
Coral cover - High	0.67	0.61	1.62	0.56	2.00	1.53
Coral cover – Very High	1.36	0.17	1.49	0.33	2.90	2.64
Reduced fish decline	0.03	0.005	0.001	0.009	-0.06	0.07
Cost	-0.005	0.17	-0.06	0.006	-0.14	0.09
Status quo	-3.46	0.18	-1.92	0.38	2.92	0.93
Class share	0.65		0.20		0.16	

680 reef attributes, with coral cover dummy coded. Significant results in bold.

681

682

Fig 7. Information cards presented to participants of the choice experiment to explain the connection between

684 terrestrial grazing, sediment run-off and coral reef decline.

Bonaire is internationally renowned as a high quality SCUBA dive destination (SCUBA Diving Magazine, 2015). However, like coral reefs worldwide, the health of Bonaire's reef is declining over the long-term.

Studies carried out on Bonaire's reef by the University of Maine (Steneck and colleagues 2003-2013) have shown the number of young corals is falling, and the diversity of fish species is changing. This will reduce the quality of the coral reef for diving.



685



Soil run-off from land is one cause of reef health decline. On Bonaire this is increased due to grazing by introduced goats, donkeys and pigs.

Goats, donkeys and pigs were introduced to Bonaire by Spanish settlers, they are not native to the island. Grazing by these animals reduces plant numbers, meaning that there are fewer roots to hold the soil, and it is washed onto the reef.

Increased soil on the reef reduces the number of young corals. In time this will lead to reduced coral cover and fish diversity. Increased soil in the water also reduces visibility for divers. One way to maintain the health of Bonaire's coral reef is therefore to reduce grazing. This could be done by:

- Restricting movements of grazing animals;
- Reducing the number of grazing animals on Bonaire;
- Restricting where goat farmers can graze their goats.



To maintain the reef requires funding. You already pay an annual nature (dive tag) fee of \$25 to STINAPA, which is used for the running of the Bonaire National Marine Park. This study is to find out if you would be willing to pay a higher fee in the future, to be used to reduce grazing. This fee would be collected at the same time as the current nature (dive tag) fee, but would be administered by a new non-governmental organisation. The fee would be guaranteed to be used for this purpose.

The following questions will present you with a choice of three dive sites under different management conditions:

- The first two dive sites show diving conditions where grazing has been reduced
- The final dive site shows diving conditions where grazing has been allowed to continue

In each round you will be asked to choose which of the three dive sites you would like to visit. You should assume that the sites are identical except in the ways presented on the card.

Each site has a different annual fee associated with it. Remember to pay close attention to the fee, and take into account the cost of your holiday, and other economic constraints before making a decision. If the prices of the dive sites with management are too high, choose the option with no management.

689 Appendix D

Species	Methods	Island	Human	Individuals	Cost/ha	Study
		size/ha	population	removed	(USD2015)	
Goat	Helicopter	58,465	No	79,000	\$129	(Cruz et al.,
	Dogs					2009)
	Judas goat					
	Corrals					
	Ground hunting					
Goat	Helicopter	464,000	Yes	59,000	\$10	(Cruz et al.,
	Dogs					2009)
	Judas goat					
	Corrals					
	Ground hunting					
Goat	Ground hunting	520	No	Unknown	\$1354	(Holmes et
	Corrals					al., 2015)
Goat	Ground hunting	500	No	Unknown	\$91	(Holmes et
	Corrals					al., 2015)
Pig	Trapping	5,700	No	200	\$120	(McCann
	Ground hunting					and
	Dogs					Garcelon,
	Judas pigs					2008)
Pig	Helicopter	25,000	No	5,036	\$219	(Melstrom,
						2014)

690 Table 5 Cost of eradication of goats and pigs from islands

Pig	Ground hunting	5,666	No	Unknown	\$118	(Massei et
	Trapping					al., 2011)
	Judas pigs					
Cattle	Ground hunting	710	No	Unknown	\$19	(Martins et
	(primary, others					al., 2006)
	unknown)					
Goat	Unknown	3,230	No	Unknown	\$13	(Martins et
						al., 2006)
Goat	Ground hunting	14,600	Yes	Unknown	\$42	(Martins et
	(primary, others					al., 2006)
	unknown)					
Goat	Ground hunting	2,938	No	Unknown	\$242	(Martins et
	(primary, others					al., 2006)
	unknown)					

Table 6 Estimated costs of donkey eradication on Bonaire for ground and aerial hunting, plus 6, 12, or 24 month monitoring period following eradication. Costs are shown per unit, as defined in row heading (e.g. day, month, or per equipment piece), and multiplied by number required for each option. Time taken for ground hunting without monitoring is 24 months, and aerial hunting without monitoring 14 months. This initial time is added to costs of 6, 12, or 24 month monitoring in each column. Costs in USD2015

	Cost	Ground hun	ting		Helicopter		
	per						
	unit	6 months	12 months	24 months	6 months	12 months	24 months
Professional							
hunter /day	320	4454400	4915200	5836800	3686400	4147200	5068800
Local hunter							
/day	160	1113600	1228800	1459200	921600	1036800	1267200
Housing							
/hunter							
/month	800	950400	1056000	1267200	598400	704000	915200
Ammunition	1500	1500	1500	1500	1500	1500	1500
GPS collar	3000	90000	90000	90000	90000	90000	90000
Fitting GPS							
collar	1000	30000	30000	30000	30000	30000	30000
Corral	2250	2250	2250	2250	2250	2250	2250
Firearms /unit	2000	72000	72000	72000	72000	72000	72000
Permit /firearm	2000	72000	72000	72000	72000	72000	72000
Dog and							
handler /day	400	1856000	2048000	2432000	1536000	1728000	2112000
Management							
/day	480	307200	364800	480000	259200	316800	432000

Transport /km	0.3	5760	6840	9000	4860	5940	8100
Vehicle	1500	3000	3000	3000	3000	3000	3000
Camera Traps	700	35000	35000	35000	35000	35000	35000
Helicopter							
/hour	2000	0	0	0	640000	640000	640000
Pilot /day	600	0	0	0	24000	24000	24000
Admin		899311	992539	1178995	797621	890849	1077305
TOTAL		9892421	10917929	12968945	8773831	9799339	11850355

701 Table 7 Breakdown of costs for removal phase of eradication by ground control only. 24 month long

project, not including monitoring of success.

Ground hunting - Removal phase	
24 Professional hunters, 24 months full time, \$40/hour	\$3,993,600.00
12 Local hunters, 24 months full time, \$20/hour	\$998,400.00
Accommodation, 36 hunters, 8 dog handlers, 24 months	\$844,800.00
Ammunition, 3000 bullets (3 times estimated donkey population)	\$1,500.00
30 GPS collars, including VHF transmitters, for Judas donkeys	\$90,000.00
Fitting GPS collar, including tranquiliser and trained personnel	\$30,000.00
Corral, fence materials for single semi-permanent corral	\$2,250.00
Firearms, 36 rifles of high power	\$72,000.00
36 firearm permits over two years (approximate fee)	\$72,000.00
8 dogs and handlers, 24 months full time, \$50/hour	\$1,664,000.00
Project manager, 24 months full time, \$60/hour	\$249,600.00
Transport, estimated 30km/day, \$0.3/km	\$4,680.00
Vehicle, used pickup, price for acquiring on island	\$3,000.00
Admin, 10% of project cost	\$802,583.00
Total	\$8,828,413.00

Table 8 Breakdown of costs for removal costs of eradication including 2 months aerial hunting and 14

707 months ground hunting, not including monitoring of success.

Ground hunting and helicopter - Removal phase	
24 Professional hunters, 14 months full time, \$40/hour	\$3,225,600.00
12 Local hunters, 14 months full time, \$20/hour	\$806,400.00
Accommodation, 36 hunters, 8 dog handlers, 14 months	\$492,800.00
Ammunition, 3000 bullets (3 times estimated donkey population)	\$1,500.00
30 GPS collars, including VHF transmitters, for Judas donkeys	\$90,000.00
Fitting GPS collar, including tranquiliser and trained personnel	\$30,000.00
Corral, fence materials for single semi-permanent corral	\$2,250.00
Firearms, 36 rifles of high power	\$72,000.00
36 firearm permits over 14 months (approximate fee)	\$72,000.00
8 dogs and handlers, 14 months full time, \$50/hour	\$1,344,000.00
Project manager, 14 months full time, \$60/hour	\$201,600.00
Transport, estimated 30km/day, \$0.3/km	\$3,780.00
Vehicle, used pickup, price for acquiring on island	\$3,000.00
Helicopter, full day for 2 months	\$640,000.00
Pilot, full time, 2 months	\$24,000.00
Admin, 10% of project cost	\$700,893.00
Total	\$7,709,823.00

Table 9 Breakdown of costs for 6 months monitoring post-eradication

6 months monitoring	
12 Professional hunters, 6 months half time, \$40/hour	\$460,800.00
6 Local hunters, 6 months half time, \$20/hour	\$115,200.00
Accommodation, 18 hunters, 4 dog handlers, 6 months	\$105,600.00
4 dogs and handlers, 6 months half time, \$50/hour	\$192,000.00
Project manager, 6 months half time, \$60/hour	\$57,600.00
Transport, estimated 30km/day, \$0.3/km	\$1,080.00
50 Camera traps, Infrared, no glow, including batteries and memory cards	\$35,000.00
Admin, 10% of project cost	\$93,228.00
Total	\$1,060,508.00

Table 10 Breakdown of costs for 12 months monitoring post-eradication

12 months monitoring	
12 Professional hunters, 12 months half time, \$40/hour	\$921,600.00
6 Local hunters, 12 months half time, \$20/hour	\$230,400.00
Accommodation, 18 hunters, 4 dog handlers, 12 months	\$211,200.00
4 dogs and handlers, 12 months half time, \$50/hour	\$384,000.00
Project manager, 12 months half time, \$60/hour	\$115,200.00
Transport, estimated 30km/day, \$0.3/km	\$2,160.00
50 Camera traps, Infrared, no glow, including batteries and memory cards	\$35,000.00
Admin, 10% of project cost	\$186,456.00
Total	\$2,086,016.00

717 Table 11 Breakdown of costs for 24 months of monitoring post-eradication

24 months monitoring	
12 Professional hunters, 24 months half time, \$40/hour	\$1,843,200.00
6 Local hunters, 24 months half time, \$20/hour	\$460,800.00
Accommodation, 18 hunters, 4 dog handlers, 24 months	\$422,400.00
4 dogs and handlers, 24 months half time, \$50/hour	\$768,000.00
Project manager, 24 months half time, \$60/hour	\$230,400.00
Transport, estimated 30km/day, \$0.3/km	\$4,320.00
50 Camera traps, Infrared, no glow, including batteries and memory cards	\$35,000.00
Admin, 10% of project cost	\$372,912.00
Total	\$4,137,032.00