

1

2 Information about conservation status is more important than species appearance in species

3 preferences of potential conservation donors

4

5 Sarah Papworth^{1*} and Polly Curtin¹

6

7 *Corresponding author: sarah.papworth@rhul.ac.uk

8 1. Department of Biological Sciences, Royal Holloway, University of London, Egham Hill,

9 Egham, TW20 0EX, United Kingdom

10

11

12 Abstract

13 There are huge differences in the conservation support and attention received by different
14 species, maybe because of preferences for specific aesthetic traits, such as body size and
15 colouring. If there are inherent preferences, then new flagship species should be aesthetically
16 similar to existing successful flagship species and conservation campaigns should not feature
17 less attractive species. However, cultural preconceptions about species and the covariance of
18 traits make it difficult to determine the role of aesthetic traits. Both these problems can be
19 overcome with imaginary animals. If preferences for certain species traits are inherent in the
20 human psyche, then the same preferences should be found in both real and imaginary
21 animals. Using an online survey with US participants, we find aesthetic traits are associated
22 with preferences for real, but not imaginary animals. For both real and imaginary animals,
23 small and declining populations are preferred. We therefore suggest organisations should not
24 reject potential flagship species based on appearance. Consistent preferences for poor
25 conservation status, plus the ability now to use our results to predict donations to real animal
26 species, suggest conservation support for specific species could be encouraged if
27 organisations communicate information about population sizes and trends.

28

29 Keywords: flagship species, online survey, environmental philanthropy, imaginary animals,
30 conservation marketing

31 Introduction

32 Popular species are those which are ‘liked, enjoyed, or supported by many people’
33 (Cambridge Online Dictionary, 2022) and there are huge differences among species; not just
34 in terms of public and media interest, but also in research and conservation support (Kellert,
35 1985, Correia et al. 2016, Colléony et al. 2017, Davies et al., 2018, dos Santos et al. 2020,
36 Adamo et al. 2021). The tiger (*Panthera tigris*) was the most googled animal and received
37 US\$44.9 million in conservation aid between 2004 and 2014 (Davies et al., 2018), three times
38 more than the next most funded species. The Christmas Island pipistrelle bat (*Pipistrellus*
39 *murrayi*) was declared extinct in 2016, but this received almost no media attention and there
40 was limited government support for conservation action (Watson, 2016). These differences
41 are not limited to animals; Adamo et al. (2021) found the number of scientific publications
42 ranged from 0 to 571 for 113 endemic plants in part of the relatively well-studied European
43 Alps. These different measures of species popularity seem to be correlated (Martín-López et
44 al 2009, Troudet et al. 2017, Jarić et al. 2019, Wang et al. 2021), and multiple papers have
45 tried to quantify what makes species popular, both to draw attention to species which are
46 relatively unattended (Davies et al., 2018) and to identify species which can, for example,
47 raise conservation awareness (Veríssimo et al. 2014).

48 More popular species tend to be large (Smith et al. 2012, Correia et al. 2016, Macdonald et
49 al. 2016, Adamo et al. 2021) and colourful (Breuer et al. 2015, Garnett et al. 2018, Adamo et
50 al. 2021), just two of many aesthetic traits which have been associated with species
51 popularity. Certain behaviours and population traits are also associated with species
52 popularity. For example, Swiss children prefer insects which fly to those which crawl (Breuer
53 et al. 2015), and various studies have shown species which are more endangered receive more
54 conservation donations than those that are not (e.g. Tisdell, 2006, Tisdell et al. 2007, Curtin

55 & Papworth, 2018). Many such studies search for traits which are assumed to be inherently,
56 and to some degree, universally, popular. For example, preferences for certain aesthetic traits
57 have been associated with the baby schema concept and the ‘uncanny valley’ theory (Rádlová
58 et al. 2018).

59 Whether or not there are inherent preferences for specific traits is important information for
60 choosing successful conservation flagship species. Conservation science is a crisis discipline,
61 which uses limited funds to prevent and reverse the negative impact of human activities on
62 biodiversity (Bottrill et al., 2008), and flagship species are a key tool used to raise money and
63 awareness (Veríssimo et al. 2011). The flagship species approach often targets individual
64 donors, which can be important contributors to conservation non-governmental organisations
65 (NGOs) – for example 14% to 89% of funding for ten marine NGOs reviewed by Berger et
66 al. (2019) came from individual contributions. Previous research on flagship species has
67 shown substantial differences in the fundraising ability of different species: there was a five-
68 fold difference in donations between the most and least successful species in an evaluation of
69 Australian Geographic Society fundraising campaigns (Veríssimo et al. 2018). A variety of
70 aesthetic traits have been identified which are associated with how successful species are at
71 raising awareness and funds (Curtin & Papworth, 2020), and if donations are driven by
72 inherent preferences for specific aesthetic traits, new flagship species should be aesthetically
73 similar to existing successful flagship species, as suggested by Smith et al. (2012). If certain
74 aesthetic traits drive successful flagship species, this could suggest conservation
75 organisations should not invest time in campaigns which feature species with traits which are
76 less ‘attractive’, even if these species are threatened and need conservation attention.
77 Therefore, understanding whether preferences for specific traits are an inherent part of the
78 human psyche is crucial for the selection and use of flagship species.

79

80 There is substantial evidence of cultural differences in species preferences, which is not
81 consistent with inherent preferences for certain species traits. For example, lions (*Panthera*
82 *leo*) are popular with schoolchildren in the U.K., but disliked by schoolchildren living around
83 a National Park in Tanzania where lions live (Entwistle & Stephenson, 2000). If preferences
84 for specific traits are an inherent part of the human psyche, we would expect to find
85 preferences for species which have those traits regardless of cultural frame. The ubiquity of
86 cultural preconceptions about the natural world makes it difficult to untangle the role of
87 inherent preferences and cultural frames (Montgomery, 2002, Garnett et al. 2018, Curtin &
88 Papworth, 2020), particularly when investigating preferences for multiple species.
89 Furthermore, identifying preferences for specific traits in real animals is complicated by the
90 covariance of many traits. Big cats are popular, but this could be because they are physically
91 large, or because they have forward facing eyes, or because they are mammals; these are all
92 traits which are correlated with species popularity (Macdonald, Burnham, Hinks, Dickman,
93 Malhi, & Macdonald, 2015).

94 One way to overcome these issues is through the use of hypothetical species. Each trait of a
95 hypothetical species can be varied individually, and presented without contexts which might
96 trigger associations with existing, real species. This approach was first used by Montgomery
97 (2002) using written descriptions of hypothetical species, and found ecological functions
98 which benefitted humans were more important to 417 US participants than other species traits
99 (including aesthetics). This suggests appearance and preferences for specific aesthetic traits
100 may be less important in the absence of existing cultural frames for a species (for example, if
101 a species is unknown or poorly known). Garnett et al. (2018) conducted the only prior study
102 which compared preferences for real and imaginary animals in a conservation context. Based
103 on written descriptions, they found 638 Australians preferred endangered, smaller, more
104 colourful hypothetical birds which are less confiding and have melodious songs. However,

105 when asked to name the Australian birds they thought most attractive, species with these
106 traits were not selected as often as expected - many participants named larger, less colourful
107 birds with harsh-sounding calls.

108 One drawback of descriptions is that they are open to interpretation by participants; for
109 example, Montgomery (2002) described one species as having 'beautiful colours and unique
110 shape'. This problem is solved by using images of imaginary animals. A study of 407
111 participants using this approach showed participants preferred to donate money to large,
112 multi-coloured and cool-toned imaginary animals (Curtin & Papworth, 2020), and these
113 preferences for imaginary animals could be used to predict donations to real, species-focused
114 conservation charities. However, this study only investigated preferences for aesthetic traits,
115 not the role of other traits such as population status, nor did it compare preferences for real
116 and imaginary animals within the same group of participants to establish whether the findings
117 on imaginary animals also applied to real animals. The present study addresses these gaps by
118 investigating and contrasting preferences for imaginary and real animals in a US online
119 community. We assume that if preferences for certain species traits are inherent preferences,
120 then the same preferences will be found in both real and imaginary animals. Specifically, this
121 study was designed to address the following questions:

- 122 1. Are preferences for unknown species affected by the provision of information about
123 conservation status, attention and benefits for humans?
- 124 2. Are preferences for real animals guided by the same aesthetic and informational traits
125 as preferences for imaginary animals?
- 126 3. Can stated preferences for real and imaginary animals predict revealed preferences for
127 species donation?

128

129 Methods

130 Survey 1: The role of imaginary animal appearance and information provision in participant
131 choices

132 A survey was designed to investigate whether preferences for unknown species could be
133 affected by provision of information about conservation status and attention and benefits for
134 humans. The survey started with demographic questions (gender, age, education, location),
135 questions about past donations to and volunteering for conservation organisations, and
136 participation in wildlife orientated activities. This was followed by a discrete choice
137 experiment (DCE) where participants were presented with choices between two imaginary
138 animals in an unlabelled, unforced stated choice DCE with a mix and match factorial design
139 (Rose & Bliemer, 2009). DCEs are a widely used to understand participants' stated and
140 revealed preferences (Rose & Bliemer, 2009), and have previously been used to understand
141 conservation donation and species preferences (e.g. Garnett et al. (2018)). Individuals are
142 presented with a series of choices between two or more options which are designed to
143 investigate preferences for specific choice characteristics. In this experiment, two imaginary
144 animals of different appearances were presented in each choice pair, with invented
145 information about their population size and trend, level of conservation attention and species
146 benefit for humans (e.g. whether the species provides ecosystem services or is a crop pest,
147 Table 1 and Fig. 1). The aesthetic traits which varied were selected based on a previous study
148 using the same imaginary animals (Curtin & Papworth, 2020). These animals were designed
149 by mural design artist Rory McCann (<https://rorymccannmurals.com/>) in three 'morphs' and
150 varied in their eye direction, colouring (number of colours and tone), body size, and whether
151 or not they had fur. Additional information on the design and appearance of the imaginary
152 animals is provided in Curtin and Papworth (2020). Quantitative information on invented
153 population size and trend was based on IUCN Red List criteria. Qualitative information on

154 conservation attention and species benefit for humans was also included (see Table 1). For
155 each choice pair, participants were asked ‘which of these animals would you rather
156 conserve?’. An opt-out choice (‘neither of these’) was included. Four blocks of nine choices
157 between pairs were generated using the ‘rotation.design’ function in the R package
158 ‘support.CEs’ (Aizaki, 2012). Participants were randomly assigned to one block.

159 After choosing between the pairs, participants were invited to explain why they made the
160 choices they did. These qualitative data were analysed to identify themes, and provide
161 context for the quantitative analyses presented here (see supplementary materials). To assess
162 participants’ revealed choices, at the end of the survey participants were informed the project
163 would donate US\$0.50 on their behalf to the Zoological Society of London’s EDGE of
164 Existence programme, which targets taxonomically diverse species which are globally
165 endangered and evolutionarily distinct (Isaac et al. 2007). Giving participants choices
166 between animals but directing all donations to the same organisation (rather than asking
167 participants to select between organisations with different focal species, see Curtin &
168 Papworth (2020)) ensured participants made their selection based on the species rather than
169 the organisation. Participants were asked which of 17 EDGE species (see supplementary
170 materials) shown in photos they would most like to see conserved, with an option to request
171 no donation be made on their behalf.

172 Survey 2: The role of appearance and information provision on participant choices for
173 imaginary and real animals.

174 A second survey was designed after the first survey was completed and analysed to
175 investigate whether preferences for real animals were influenced by the same factors
176 associated with preferences for imaginary animals. Therefore, participants were presented
177 with choices between animals in two DCEs, one with imaginary animals and the other with

178 real animals. These two DCEs were designed simultaneously to ensure congruence between
179 the variables investigated. To reduce the number of choice options we limited population size
180 and trends to two categories (see Table 1). Benefits for humans was excluded as for real
181 animals this can vary with cultures and different individual experiences, thus it was difficult
182 to identify appropriate real animals (for example, some consider beavers beneficial for flood
183 prevention, others view them as pests, McKinstry & Anderson, 1999). Conservation attention
184 was also excluded as it was not identified as important in survey 1 and it is difficult to
185 classify the differing types of conservation attention received by real animals into meaningful
186 ordinal levels.

187 For the real animals, we contrasted mammals and birds rather than furred and unfurred
188 animals. Birds of prey, primates, felids and a limited number of other species groups (e.g.
189 *Didelphis* species) were considered to have forward facing eyes (Heesy, 2004). We identified
190 species population sizes and trends from the IUCN Red List, and considered species with
191 populations over 10,000 individuals to have large populations, and those with fewer than
192 5,000 individuals to have small populations. These changes from the values used in survey 1
193 were necessary as few species have very small populations. Colours and patterns were
194 classified visually, but there are few animals which are truly 'single coloured'. Therefore,
195 when selecting animals we ensured contrasts were evident between each pair (Fig. 2). The
196 large differences in body mass between birds and mammals meant different definitions for
197 'small' (<1kg for birds and <12kg for mammals) and 'large' (>1.2kg for birds and >19kg for
198 mammals) species, though as with colours the contrast between species in a pair was
199 considered in the design (e.g. the largest 'small' mammal, the Tonkin snub-nosed langur,
200 *Rhinopithecus avunculus*, was contrasted with the largest 'large' mammal, Grevy's zebra,
201 *Equus grevyi*). There were some restrictions for the experimental design as we were unable to
202 identify a real animal which had forward facing eyes, was under 12kg and a cool-toned single

203 colour, and was assessed by the IUCN Red List to have a stable population with less than
204 5,000 individuals. We therefore had to generate three study designs using the
205 ‘rotation.design’ function (Aizaki, 2012) before generating a design where we were able to
206 identify suitable real animals for the variable combinations. Once suitable real animals were
207 identified, Rory McCann (<https://rorymccannmurals.com/>) drew images using the same
208 medium as used for the imaginary animals.

209 For the imaginary animals DCE, four blocks of six choice sets were generated using the
210 ‘rotation.design’ function (Aizaki, 2012). Participants were randomly assigned to one block.
211 For the real animals DCE, a single block with eight choice sets was completed by all
212 participants. In the final section where participants were asked to select an EDGE species,
213 information about the species population size and trend (where available) was included as
214 well as the pictures. All other aspects of the survey were identical to survey 1.

215 Distribution and data quality

216 Both surveys were designed in the online survey tool ‘Qualtrics’ (Qualtrics, Provo, UT).
217 Survey populations were recruited from Amazon Mechanical Turk (MTurk) and paid
218 US\$0.35, the amount recommended by MTurk for the survey length. In the first survey,
219 participants from any country could participate, but analyses were restricted to those from the
220 USA after data collection. In the second survey, only those from the USA were invited to
221 participate. All participants were over 18 years of age and only those who reported engaging
222 in conservation-related donation or volunteering behaviors were considered for inclusion.
223 MTurk has a diverse participant pool, and allows rapid, cost-effective data collection which
224 outperforms panel data (Kees et al. 2017) and has been used in various previous conservation
225 papers (e.g. Thomas-Walters & Raihani, 2017). Nevertheless, there are documented concerns
226 surrounding the reliability of data from MTurk (Chmielewski & Kucker, 2020). Therefore,

227 measures were employed to minimize the inclusion of fake participants or ‘bots’. Surveys
228 completed in less than one third of the median time (speeders in Table 2, Macdonald et al.
229 2015) were excluded. Three multiple choice questions with randomised answer order were
230 included: one question on self-reported involvement, one attention check, and one
231 instructional manipulation check (Kees et al. 2017). Only participants who passed at least two
232 of three data quality checks were included in analyses (Data quality measurement, Table 2).
233 A final check was applied to the ‘free-text’ questions, with participants removed if their
234 answers suggested the question was not understood (misinterpreted questions in Table 2,
235 Chmielewski & Kucker, 2020).

236 Analyses

237 Analyses were conducted in R 3.6.3 (R Development Core Team, 2020). The DCE was
238 analysed using mixed logit models (Aizaki, 2012). Estimates from the DCE models were
239 used to predict preferences for the EDGE species shown at the end of each survey. As the
240 EDGE species were presented without accompanying information in survey 1, only aesthetic
241 traits were used to predict preferences from the survey 1 DCE. In survey 2, participants were
242 presented with information on the population size and trend (when available), so all variables
243 were used to predict preferences from DCEs in survey 2. For species where information on
244 population size or trend were unavailable (thus stated as ‘unknown’ for participants),
245 predictions were made for both variable levels (e.g. both large and small populations) and the
246 mean value used in analysis. For EDGE species which were neither a bird nor mammal (e.g.
247 Round Island boa, *Casarea dussumieri*), predictions were made for both categories and
248 averaged. For predictions from the imaginary animal DCEs, the probability of selecting
249 animal type ‘C’ with the same aesthetic traits was calculated. Generalised linear models were
250 used to determine whether the predicted preferences could predict the number of participants
251 who chose each EDGE species, with Gaussian, poisson and negative binomial errors

252 distributions (from the package MASS, Venables & Ripley, 2002) compared for model fit
253 using the package ‘performance’ (Lüdtke et al. 2021).

254 Results

255 Participants

256 Two hundred and seventy eight and 342 participants completed surveys 1 and 2 respectively,
257 being based in the USA with a previous history of donation to or volunteering for
258 conservation or nature organisations (Table 2). In both surveys, most participants were under
259 39 (68% in survey 1 and 62% in survey 2), in full time employment (77% and 70%
260 respectively) and had a Bachelor’s degree or higher qualification (75% and 74%
261 respectively).

262 DCE results

263 Compared to animals with reported population sizes of 200 individuals, the 278 participants
264 in survey 1 were less likely to select animals with 2000 individuals, and about half as likely
265 to select animals with 9000 individuals (Table 3, Fig. 3). Participants were more likely to
266 select animals with reported declining trends compared to animals with reported stable
267 population trends, with more than twice the likelihood for animals with reported 80% decline
268 and an intermediate value for those with 30% decline. Compared to neutrally described
269 species, participants were more likely to select animals which were described as beneficial
270 and less likely to select animals which were described as pests. There was no effect of the
271 level of conservation attention received or the experimentally manipulated aesthetic traits,
272 though participants were less likely to select animals of type A and B than animal type C
273 (Table 3). Two hundred and thirty five participants provided free text explanations of why
274 they chose the animals they did (Table S1), with ecological role (mentioning the relationship
275 between the animal and the wider environment) the most common theme (n = 86).

276 Participants also mentioned population trend (n=57), population size (n=53) and conservation
277 effort (n=32), but fewer mentioned the animals' appearance (n=14).

278 When presented with imaginary animals, the 342 participants in survey 2 had comparable
279 results to survey 1 (Table 3, Fig. 3); participants were half as likely to choose a species with a
280 large population and almost four times as likely to choose a species with a declining
281 population. No significant effect of appearance was found except participants were less likely
282 to select animals of type A and B compared to animal type C. Two hundred and eighty-five
283 participants provided free text explanations of their choices, and population trend was most
284 commonly cited (n=157), although appearance (n=72) and population size (n=60) were also
285 often mentioned (Table S1).

286 When these same 342 participants chose between real animals, specific aesthetic traits did
287 affect their choices (Table 3, Fig. 3). Participants were half as likely to select animals with
288 sideways facing eyes, and less likely to select cool-toned animals. Contrary to expectations,
289 participants were more likely to select bird than mammal species, but remained around half
290 as likely to select species with larger populations and more than four times as likely to select
291 those with declining populations. Two hundred and sixty-six participants provided free text
292 explanations of their choices for real animals with most mentioning population trend (n=167)
293 and some mentioning population size (n=56). References to appearance (n=31) were fewer,
294 although 16 participants reported choosing a particular type of animal (Table S1).

295 Revealed choices

296 Across both surveys, the red panda was most often selected by participants and the West
297 African dwarf crocodile least often selected (Table S2). Number of donors for each species
298 was positively correlated between surveys 1 and 2 (Spearman's $\rho=0.65$, S statistic=338.4,
299 $p=0.003$). Predicted preferences for the 17 species from survey 1 were positively correlated

300 with the number of participants selecting each species (negative binomial regression, $n=17$,
301 $\chi^2=11.56$, Nagelkerke's $R^2=0.36$, $p=0.003$). The black rhino was excluded as an influential
302 outlier for both analyses using predictions from survey 2 (Cook's distance >0.5). It was the
303 only species with a stable population and the large effect size of population trend meant
304 predicted preferences were 2.9 and 3.3 standard deviations below the mean for the real and
305 imaginary animal predictions respectively. For the 16 remaining species, the number of
306 donations was positively correlated with both predictions from the imaginary animal DCE
307 (negative binomial regression, $n=16$, $\chi^2=9.88$, Nagelkerke's $R^2=0.27$, $p=0.007$) and real
308 animal DCE (negative binomial regression, $n=16$, $\chi^2=13.11$, Nagelkerke's $R^2=0.49$, $p=0.001$).

309 Discussion

310 Conservation status and benefits for humans affected preferences for imaginary animals in
311 the predicted directions, with potential conservation donors preferring animals with small,
312 declining populations which were beneficial for humans. These results show information
313 provision can affect preferences for unknown species, supporting prior research which shows
314 these traits can affect preferences for real species (Tisdell, 2006, Wilson & Tisdell, 2005,
315 Schlegel & Rupf, 2010, Curtin & Papworth, 2018). Although there were differences in
316 preferences for the three imaginary animal morphs, no effect of specific aesthetic traits was
317 found. This contrasts with preferences for larger, cool-toned and multi-coloured animals
318 found by Curtin and Papworth (2020) using the same methodology and imaginary animals.
319 Combined, this suggests that specific aesthetic traits may influence choices in the absence of
320 other information (Curtin & Papworth, 2020), but these effects are eclipsed by information
321 provision, specifically information about conservation status and benefits for humans. This is
322 supported by participants' post-hoc justifications – very few mentioned animal appearance
323 and the most common themes referenced ecological roles, or population size and trend.
324 Previous studies which have investigated preferences for hypothetical animals have found

325 effects of both aesthetic and non-aesthetic traits (e.g. colour and conservation status, Garnett
326 et al. 2018). However, like the present study, Montgomery (2002) found aesthetic traits less
327 important than other traits measured in their study, for example, ecological benefits. Thus
328 using non-aesthetic traits (e.g. conservation status) to select potential conservation flagships
329 might be more successful than basing selection on aesthetic traits.

330 In this study we found the effects of population size and trend were of a similar magnitude
331 and had overlapping confidence intervals for real and imaginary animals. Prior research on
332 real animals shows that providing information about IUCN threat status can change donor
333 preferences, leading them to prefer more threatened species (Veríssimo et al. 2017, Curtin &
334 Papworth, 2018). Garnett et al. (2018) found stated preferences for more threatened species,
335 but very few participants selected threatened species as their named preferred species. Unlike
336 aesthetic traits, which a participant can identify from a picture, informational traits such as
337 conservation status can only be used to guide preferences if a participant is aware them. This
338 could be either because a participant has prior knowledge of the species, or because others
339 provide this information (as was the case in this, and other studies mentioned above). This
340 may explain why few participants named threatened species in the study by Garnett et al.
341 (2018) – they may be unaware of the relative conservation status of animals which they
342 know.

343 When participants participated in matched DCEs on imaginary and real animals, there was
344 evidence to support the role of specific aesthetic traits in decision-making for real, but not
345 imaginary animals. When choosing between real animals, participants preferred warm-toned
346 birds with forward facing eyes, which contrasts with the lack of effect found in this study and
347 the preference for large, cool-toned and multi-coloured imaginary animals in Curtin and
348 Papworth (2020). We argue that this suggests that the preferences for certain aesthetic traits
349 found across various studies are not inherent. One explanation for these previous findings is

350 correlation between seemingly preferred aesthetic traits and other traits which are actually
351 preferred. For example, in some species groups, animals with greater body mass tend to be at
352 greater risk of extinction (Chichorro et al. 2019). The potential for these correlations was
353 highlighted in this study by the difficulty in identifying real animals with certain trait
354 combinations; there are very few species with some traits, and other traits are only found in
355 closely related species. For example, most animals with forward facing eyes are either
356 primates or felids, but it may not be this trait which makes these groups popular. For
357 example, primates may be popular due to their similarity with humans, and felids popular for
358 their predatory behaviour; both traits were suggested by Kellert (1985) as important in
359 influencing preferences for animals in the USA.

360 This study showed that stated preferences for real and imaginary animals can predict revealed
361 preferences for species donation. All three experiments were able to predict the number of
362 donations received by real EDGE species, although the variance explained by the model
363 (described using Nagelkerke's R^2) was greatest when predicting from preferences for real
364 animals. Therefore, even though the underlying mechanism for species preferences remains
365 unknown, the preferences found in this research were able to predict participant behaviour.
366 Regardless of the mechanism, consistent preferences for poor conservation status in this and
367 other studies suggest the conservation of both well-known and little known species could be
368 encouraged if organisations communicate information about their population size and trends.
369 However, there are likely differences between individuals in which species appeal and how
370 much they are willing to donate, as found by Lundberg et al. (2020) in their study of US and
371 UK conservation donors. Further research which identifies similar groups of donors and tests
372 possible mechanisms of species preferences would provide guidance about which traits to
373 investigate as predictors of conservation philanthropy, and improve the accuracy of
374 predictions. Investigation of more diverse and less easily quantified species traits, such as

375 intelligence (Kellert, 1985), may identify other traits which are more important than species
376 appearance, and improve predictions of conservation philanthropy. However, for these less
377 physically tangible traits, the perceptions of traits are likely more important than the traits
378 themselves, and will be mediated by cultural knowledge, consistent with the theory of
379 flagship species action (Jepson & Barua, 2015). For example, even though recent research
380 shows chickens are more cognitively complex than previously believed (Marino, 2017),
381 public perceptions of chicken intelligence will not necessarily reflect this research. Research
382 which identifies cultural perceptions associated with successful flagships and popular species
383 and then tests whether lesser known, less popular species can be relocated within these
384 frames using conservation marketing techniques, may be a fruitful area for future applied
385 research.

386 *Acknowledgements*

387 This work was made possible by the work of Rory McCann, and the research participants.
388 Thank you to them and the many people who discussed the imaginary animal project over its
389 development. Data are available from Figshare, DOI: 10.17637/rh.16838008.

390 *Financial support*

391 This work and the salary of Polly Curtin was supported by a National Geographic Society
392 grant ‘preventing biodiversity loss depends on understanding how people choose what to
393 conserve (NGS-53291R-18).

394 *Conflict of Interest*

395 None

396 *Ethical Standards*

397 The study was approved by the Royal Holloway Ethical Approval Process.

399 References

- 400 Adamo M, Chialva M, Calevo J, Bertoni F, Dixon K & Mammola S (2021) Plant scientists'
401 research attention is skewed towards colourful, conspicuous and broadly distributed
402 flowers. *Nature Plants* **7**: 574–578 2
- 403 Aizaki H (2012) Basic Functions for Supporting an Implementation of Choice Experiments
404 in R. *Journal of Statistical Software* **50** (2): 1-24
- 405 Berger MF, Caruso V & Peterson E (2019) An updated orientation to marine conservation
406 funding flows. *Marine Policy* **107**: 103497
- 407 Bottrill MC, Joseph LN, Carwardine J, Bode M, Cook C, Game ET, Grantham H, Kark S,
408 Linke S, McDonald-Madden E, Pressey RL, Walker S, Wilson KA & Possingham HP
409 (2008) Is conservation triage just smart decision making? *Trends in Ecology and*
410 *Evolution* **23**: 649–654
- 411 Breuer GB, Schlegel J, Kauf P & Rupf R (2015) The Importance of Being Colorful and Able
412 to Fly: Interpretation and implications of children's statements on selected insects and
413 other invertebrates. *International Journal of Science Education* **37**: 2664–2687
- 414 Cambridge Online Dictionary (2022) 'Popular'. URL
415 <https://dictionary.cambridge.org/dictionary/english/popular> Accessed 10/06/22
- 416 Chichorro F, Juslén A & Cardoso P (2019) A review of the relation between species traits
417 and extinction risk. *Biological Conservation* **237**: 220–229
- 418 Chmielewski M & Kucker SC (2020) An MTurk Crisis? Shifts in Data Quality and the
419 Impact on Study Results. *Social Psychological and Personality Science* **11**: 464–473
- 420 Colléony A, Clayton S, Couvet D, Saint Jalme M & Prévot AC (2017) Human preferences
421 for species conservation: Animal charisma trumps endangered status. *Biological*
422 *Conservation* **206**: 263–269
- 423 Correia RA, Jepson PR, Malhado ACM & Ladle RJ (2016) Familiarity breeds content:
424 Assessing bird species popularity with culturomics. *PeerJ* **4**: e1728

425 Curtin P & Papworth S (2018) Increased information and marketing to specific individuals
426 could shift conservation support to less popular species. *Marine Policy* **88**: 101–107

427 Curtin P & Papworth S (2020) Coloring and size influence preferences for imaginary
428 animals, and can predict actual donations to species-specific conservation charities.
429 *Conservation Letters* **13**: e12723

430 Davies T, Cowley A, Bennie J, Leyshon C, Inger R, Carter H, Robinson B, Duffy J,
431 Casalegno S, Lambert G & Gaston K (2018) Popular interest in vertebrates does not
432 reflect extinction risk and is associated with bias in conservation investment. *PLoS ONE*
433 **13**: 1–13

434 Entwistle AC & Stephenson PJ (2000) Small mammals and the conservation agenda. In:
435 *Priorities for the Conservation of Mammalian Diversity: Has the Panda had its Day?*,
436 eds. A. Entwistle & N. Dunstone, pp. 119–139. Cambridge: Cambridge University
437 Press.

438 Garnett ST, Ainsworth GB & Zander KK (2018) Are we choosing the right flagships? The
439 bird species and traits Australians find most attractive. *PLoS ONE* **13**: e0199253

440 Heesy CP (2004) On the relationship between orbit orientation and binocular visual field
441 overlap in mammals. *Anatomical Record - Part A Discoveries in Molecular, Cellular,*
442 *and Evolutionary Biology* **281**: 1104–1110

443 Isaac NJB, Turvey ST, Collen B, Waterman C, Bailie JEM (2007) Mammals on the EDGE:
444 Conservation priorities based on threat and phylogeny. *Plos ONE* 2(3): e296

445 Jarić I, Correia RA, Roberts DL, Gessner J, Meinard Y & Courchamp F (2019) On the
446 overlap between scientific and societal taxonomic attentions — Insights for
447 conservation. *Science of the Total Environment* **648**: 772–778

448 Jepson P, Barua M (2015) A theory of flagship species action. *Conservation and Society* 13:
449 95-104

450 Kees J, Berry C, Burton S & Sheehan K (2017) An Analysis of Data Quality: Professional
451 Panels, Student Subject Pools, and Amazon's Mechanical Turk. *Journal of Advertising*
452 **46**: 141–155

453 Kellert SR (1985) American Attitudes Toward and Knowledge of Animals: An Update.
454 *Advances in Animal Welfare Science 1984* **1**: 177–213

455 Lüdecke D, Ben-Shachar M, Patil I, Waggoner P & Makowski D (2021) performance: An R
456 Package for Assessment, Comparison and Testing of Statistical Models. *Journal of*
457 *Open Source Software* **6**: 3139

458 Lundberg P, Veríssimo D, Vainio A & Arponen A (2020) Preferences for different flagship
459 types in fundraising for nature conservation. *Biological Conservation* **250**: 108738

460 Macdonald DW, Jacobsen KS, Burnham D, Johnson PJ & Loveridge AJ (2016) Cecil: A
461 moment or a movement? Analysis of media coverage of the death of a lion, *Panthera*
462 *leo*. *Animals* **6**: 26

463 Macdonald EA, Burnham D, Hinks AE, Dickman AJ, Malhi Y & Macdonald DW (2015)
464 Conservation inequality and the charismatic cat: *Felis feliscis*. *Global Ecology and*
465 *Conservation* **3**: 851–866

466 Marino L (2017) Thinking chickens: a review of cognition, emotion, and behavior in the
467 domestic chicken. *Animal Cognition* **20**: 127–147

468 Martín-López B, Montes C, Ramírez L & Benayas J (2009) What drives policy decision-
469 making related to species conservation? *Biological Conservation* **142**: 1370–1380

470 McKinstry MC & Anderson SH (1999) Attitudes of private- and public-land managers in
471 Wyoming, USA, toward beaver. *Environmental Management* **23**: 95–101

472 Montgomery CA (2002) Ranking the benefits of biodiversity: An exploration of relative
473 values. *Journal of Environmental Management* **64**: 313–326

474 R Core Team (2020). R: A language and environment for statistical computing. R Foundation
475 for Statistical Computing, Vienna, Austria. URL <https://www.R-project.org/>.

476 Rádlová S, Landová E & Frynta D (2018) Judging others by your own standards:
477 Attractiveness of primate faces as seen by human respondents. *Frontiers in Psychology*
478 **9**: 1–16

479 Rose JM & Bliemer MiCJ (2009) Constructing efficient stated choice experimental designs.
480 *Transport Reviews* **29**: 587–617

481 dos Santos JW, Correia RA, Malhado ACM, Campos-Silva JV, Teles D, Jepson P & Ladle
482 RJ (2020) Drivers of taxonomic bias in conservation research: a global analysis of
483 terrestrial mammals. *Animal Conservation* **23**: 679–688

484 Schlegel J & Rupf R (2010) Attitudes towards potential animal flagship species in nature
485 conservation: A survey among students of different educational institutions. *Journal for*
486 *Nature Conservation* **18**: 278–290

487 Smith RJ, Veríssimo D, Isaac NJB, & Jones KE (2012) Identifying Cinderella species:
488 Uncovering mammals with conservation flagship appeal. *Conservation Letters* **5**: 205–
489 212

490 Thomas-Walters L & J Raihani N (2017) Supporting Conservation: The Roles of Flagship
491 Species and Identifiable Victims. *Conservation Letters* **10**: 581–587

492 Tisdell C (2006) Knowledge about a species' conservation status and funding for its
493 preservation: Analysis. *Ecological Modelling* **198**: 515–519

494 Tisdell C, Nantha HS & Wilson C (2007) Endangerment and likeability of wildlife species:
495 How important are they for payments proposed for conservation? *Ecological Economics*
496 **60**: 627–633

497 Troudet J, Grandcolas P, Blin A, Vignes-Lebbe R & Legendre F (2017) Taxonomic bias in
498 biodiversity data and societal preferences. *Scientific Reports* **7**: 1–14

499 Venables WM & Ripley BD (2002) *Modern Applied Statistics with S*. Fourth Edi. New York:
500 Springer

501 Veríssimo D, Campbell HA, Tollington S, MacMillan DC & Smith RJ (2018) Why do people
502 donate to conservation? Insights from a ‘real world’ campaign. *PLoS ONE* **13**: 1–15

503 Veríssimo D, MacMillan DC & Smith RJ (2011) Toward a systematic approach for
504 identifying conservation flagships. *Conservation Letters* **4**: 1–8

505 Veríssimo D, Pongiluppi T, Santos MCM, Develey PF, Fraser I, Smith RJ & Macmillan DC
506 (2014) Using a Systematic Approach to Select Flagship Species for Bird Conservation.
507 *Conservation Biology* **28**: 269–277

508 Veríssimo D, Vaughan G, Ridout M, Waterman C, MacMillan D & Smith RJ (2017)
509 Increased conservation marketing effort has major fundraising benefits for even the least
510 popular species. *Biological Conservation* **211**: 95–101

511 Wang Z, Zeng J, Meng W, Lohman DJ & Pierce NE (2021) Out of sight, out of mind: public
512 and research interest in insects is negatively correlated with their conservation status.
513 *Insect Conservation and Diversity* **14**: 700-708

514 Watson J (2016) Bring climate change back from the future. *Nature* **534**: 437

515 Wilson C & Tisdell C (2005) What Role Does Knowledge of Wildlife Play in Providing
516 Support for Species Conservation? *Journal of Social Sciences* **1**: 47–51

517

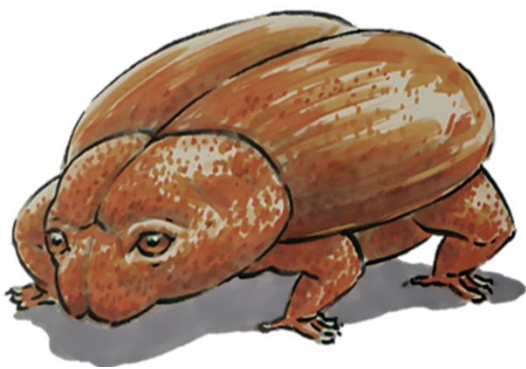
518

519 **Figure 1.** Example presentation of two options in the imaginary animal DCE in survey 1. The
520 two animals are both large and single-coloured, but the upper imaginary animal is cool-toned
521 animal type C and the lower is warm-toned animal type A. The two animals also have
522 differences in non-aesthetic traits, as communicated in the text above. An opt-out ('neither of
523 these') was also included.

Population size – 9000 individuals
Population Trend – Stable
Conservation Attention – Limited
conservation efforts
Seed disperser



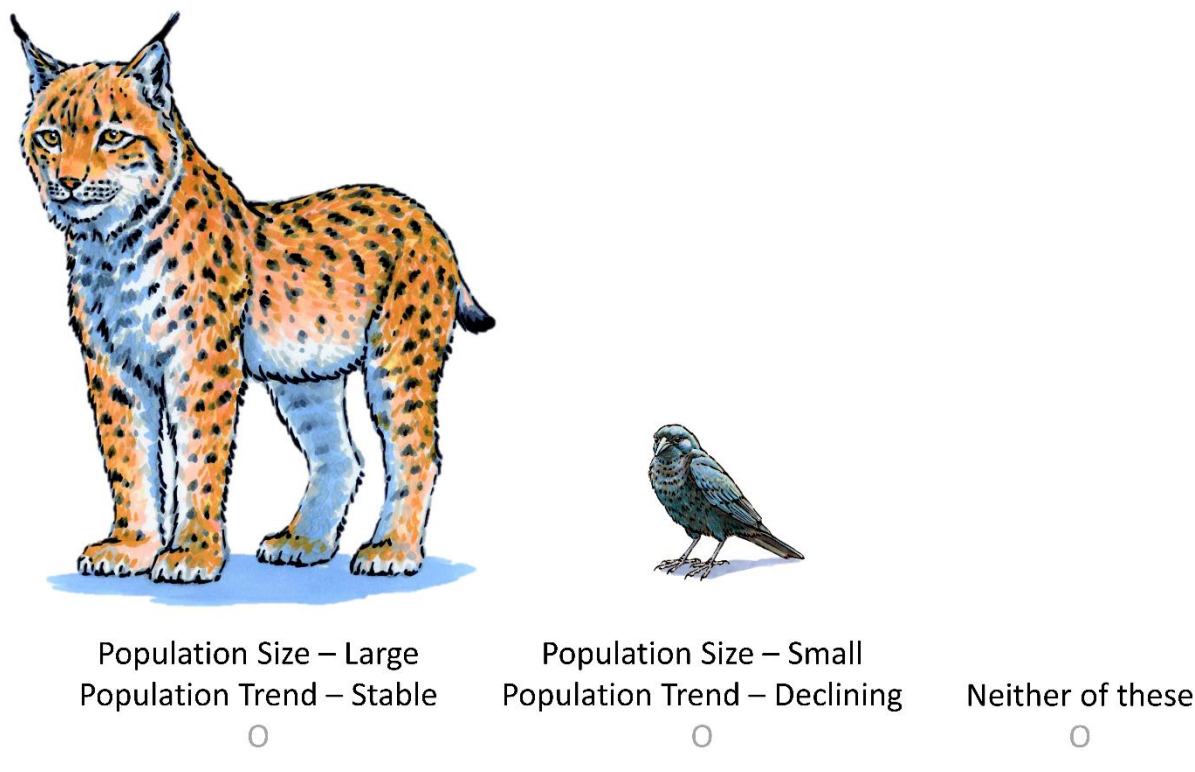
Population size – 200 individuals
Population Trend – Stable
Conservation Attention – Active
conservation efforts
Removes decaying organic matter,
helping to maintain ecosystems



524

525

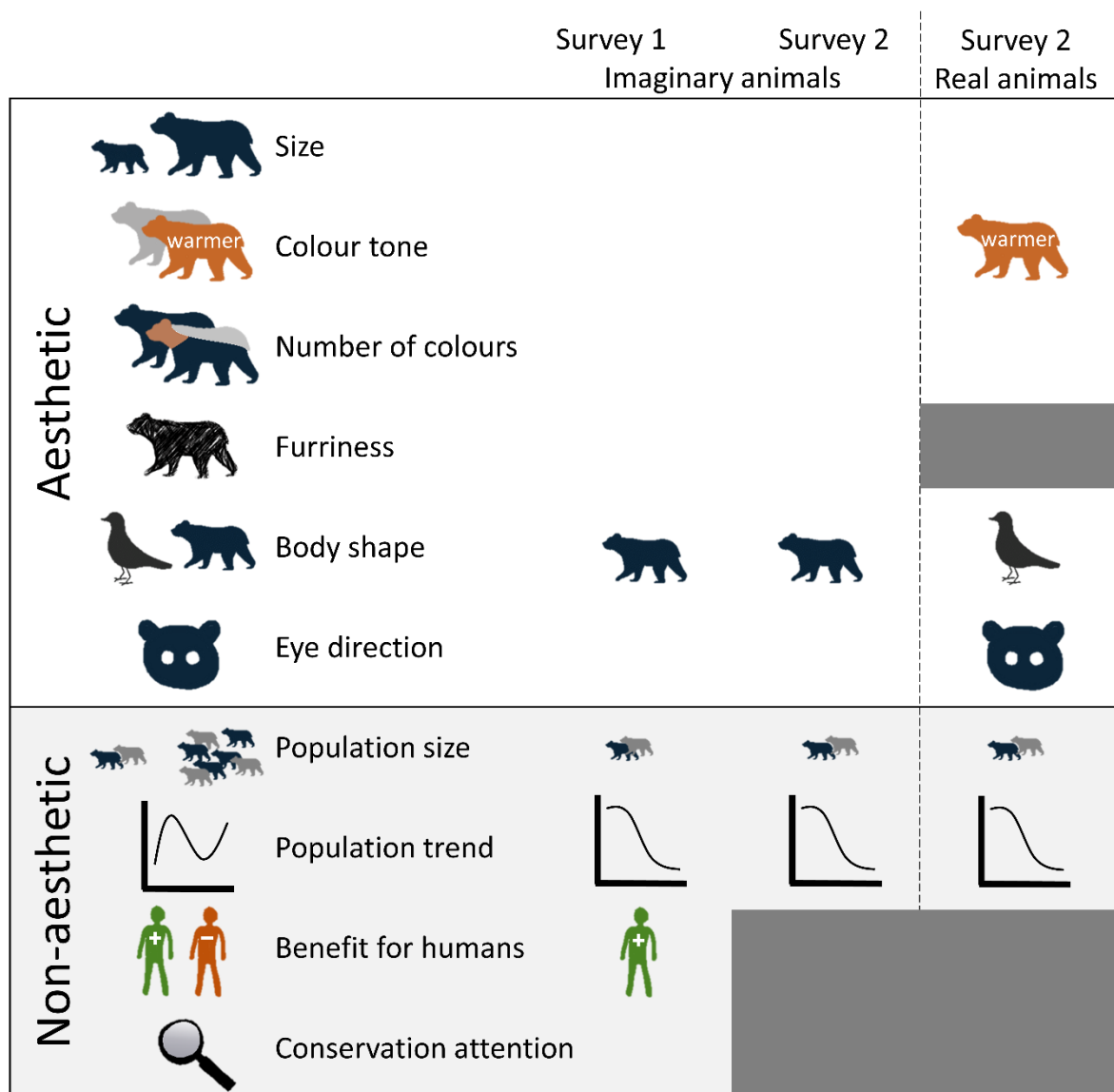
526 Figure 2. Example presentation of two options in the real animal DCE of survey 2. The
527 Eurasian lynx (*Lynx lynx*) was classed as large, warm-toned and multi-coloured when
528 contrasted with the Jamaican blackbird (*Nesopsar nigerrimus*), which was classed as smaller,
529 cool-toned and single coloured. An opt-out ('neither of these') was also included.



530

531

532 Figure 3. Study design of the three discrete choice experiments, with icons showing which
 533 traits participants preferred in each study. Across all three experiments, participants preferred
 534 animals with small and declining populations. In survey 1, participants preferred animals
 535 which benefited humans, but neither this nor conservation attention were included as
 536 variables in survey 2. No preferences for aesthetic traits were found for imaginary animals,
 537 but participants preferred real animals which were birds, warm-toned, and with forward
 538 facing eyes.



539

540 *Table 1: Explanatory variables included in discrete choice experiments. Predictions for*
 541 *aesthetic traits follow the results of Curtin and Papworth (2020). * IUCN critically*
 542 *endangered criteria C. ** IUCN critically endangered criteria A.*

Variable	Prediction	Levels (survey 1)	Levels (survey 2)
Eye direction	No effect	forward facing / side facing	forward facing / side facing
Fur	No effect	furred / unfurred	furred / unfurred
Colour tone	Prefer cool-toned animals	warm tones / cool tones / dull tones	warm tones / cool tones
Number of colours	Prefer multi coloured animals	single colour / multi coloured	single colour / multi coloured
Body size	Prefer larger animals	small / medium / large	small / large
Population size	Prefer more threatened animals (Curtin & Papworth, 2018; Tisdell, 2006; Wilson & Tisdell, 2005)	200 individuals / 2000 individuals / 9000 individuals *	fewer than 5000 individuals / more than 10000 individuals
Population decline	Prefer more threatened animals (Curtin & Papworth, 2018; Tisdell, 2006; Wilson & Tisdell, 2005)	80% decline over 3 generations / 30% decline over 3 generations / stable **	stable / declining
Conservation attention	No preference (Veríssimo et al., 2017)	None / limited / active	not included
Benefit for humans	Prefer beneficial, then neutral, then pest animals (Schlegel & Rupf, 2010)	Pest / beneficial / neutral	Not included

543

544 *Table 2: Reasons for removal of participants who started surveys 1 and 2 and demographic*
 545 *characteristics for participants included in analysis. Note that in survey 2, only MTurk*
 546 *workers from the USA were permitted to start the survey.*

		Number of participants	
		Survey 1	Survey 2
Participants starting the survey		714	682
Reasons for removal	Survey not completed	96	129
	Not situated within the USA	134	0
	No History of Donating Behavior	122	147
	Speeder	8	15
	Failed Data Quality Measurement	73	42
	Misinterpreted questions	3	7
Total Participants Removed		436	340
Total Participants included		278	342
Demographic characteristics			
Sex	Female	143	146
	Male	135	194
	Prefer not to say	0	2
Age	18-29	104	97
	30-39	84	116
	40-49	48	54
	50-59	25	43
	60-69	16	29
	70+	1	3
	Prefer not to say	0	0
Employment	Full time	213	240
	Part time	36	56
	Retired / Student /Unemployed	28	42
	Prefer not to say	1	4
Education	No qualifications	1	1
	High School Diploma	69	87
	Bachelor's degree	148	194
	Postgraduate degree	60	60
Donated Money to a Conservation Project	No	45	83
	Yes	233	259
Donated Money for a Specific Species	No	118	158
	Yes	160	184
Volunteered for a Conservation Project	No	153	207
	Yes	125	135
Donated Money to a Nature Project	No	37	50
	Yes	241	292

Table 3: Model estimates from three discrete choice experiments across two surveys. Hazard ratios greater than 1 suggest an animal with the trait is more likely to be selected, and below 1 suggest it is less likely to be selected. Variables where $p < 0.05$ are shown in bold.

	Hazard ratio (95% confidence interval), Z statistic and p value		
Variable	Imaginary animals (survey 1)	Imaginary animals (survey 2)	Real animals (survey 2)
Selection of an animal rather than	6.03(4.48-8.11), Z=11.87, p<0.001	2.37(1.86 -3.03), Z=6.92, p<0.001	4.83(3.54 – 6.58), Z=9.96, p<0.001
Size (Medium)	1.03(0.88-1.21), Z=-0.35, p=0.724		
Size (Large)	1.02(0.86-1.21), Z=0.26, p=0.796	1.01(0.89-1.16), Z=0.21, p=0.837	1.10(0.98 – 1.24). Z=1.62, p=0.106
Eye direction (side)	0.88(0.76-1.01), Z=-1.88, p=0.060	0.96(0.82 – 1.11), Z=-0.58, p=0.561	0.48(0.39 – 0.58), Z=-7.26, p<0.001
Number of colours (three colours)	1.07(0.94-1.21), Z=1.01, P=0.314	1.07(0.92 – 1.23), Z=0.872, p=0.383	0.96(0.80 – 1.15), Z=-0.42, p=0.674
Colour tone (cool)	1.04(1.87-1.21), Z=0.45, p=0.656	0.89(0.77-1.03), Z=-1.55, p=0.122	0.61(0.54 – 0.70), Z=-7.42, p <0.001
Colour tone (dull)	1.17(0.96-1.44), Z=1.58, p=0.114		
Not mammalian (unfurred)	0.88(0.76-1.02), Z=-1.76, p=0.083	0.92(0.81 – 1.05), Z=-1.21, p=0.226	
Bird			1.18 (1.04 – 1.33), Z=2.65, p=0.008
Animal type (A)	0.75(0.64-0.88), Z=-3.55, p<0.001	0.51(0.43 – 0.61), Z=-7.33, p<0.001	
Animal type (B)	0.76(0.63-0.91), Z=-2.99, p=0.003	0.72(0.62 – 0.85), Z=-3.94, p<0.001	
Population size (medium)	0.61(0.52-0.71), Z= -6.34, p<0.001		
Population size (large)	0.49(0.42-0.56), Z=-9.54, p<0.001	0.53(0.45-0.61), Z=-8.24, p<0.001	0.52(0.44 – 0.61), Z=-7.85, p<0.001
Population trend (moderate decline)	1.84(1.54-2.20), Z=6.60, p<0.001		
Population trend (severe decline)	2.16(1.82-2.55), Z=8.92, p<0.001		
Population trend (decline)		3.92 (3.40–4.52), Z = 18.79, p < 0.001	4.60 (4.07–5.19), Z = 24.54, p < 0.001
Conservation attention (limited)	0.96(0.80-1.16), Z=-0.40, p=0.686		
Conservation attention (active)	1.03(0.86-1.22), Z=-0.29, P=0.772		
Pest species	0.40(0.34-0.47), Z=-10.84, p<0.001		
Beneficial species	1.48(1.22-1.80), Z=3.99, p<0.001		
	Concordance = 0.77(\pm SE0.01), Adj. rho ² =0.25	Concordance = 0.73(\pm SE0.01), Adj. rho ² =0.18	Concordance = 0.83(\pm SE0.01), Adj. rho ² =0.34