1	A framework for prioritising conservation translocations to mimic natural ecological
2	processes under climate change: a case study with African antelopes
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ABSTRACT: Ongoing climate change is leading to significant range shifts in many 12 taxa. Although climate-induced spatiotemporal dynamics have subtle implications for 13 prioritization of translocation release areas, the terminology underlying current 14 guidelines for conservation translocation remains focused on a dichotomy between 15 'reintroductions' within the indigenous range and 'assisted colonisations' anywhere 16 else. We here propose a dispersal barrier-based framework for categorizing release 17 areas according to their compatibility with natural ecological processes under climate 18 change. Setting as a criterion that consistently suitable conditions are forecast over the 19 20 timeframe considered, we define six translocation types corresponding to six translocation release zones: 'reinforcement' within the 'stable current range'; 'assisted 21 dispersal sensu stricto' within the 'expected novel range'; 'compensatory dispersal' 22 within the 'idealized novel range' (ie. projected only if simulating absence of 23 24 anthropogenic dispersal barriers); 'accelerated dispersal' within the 'expected connected envelope' (ie. the spatiotemporally connected bioclimatic envelope beyond 25 dispersal range); 'accelerated compensatory dispersal' within the 'idealized connected 26 envelope' (ie. unreachable connected envelope only if simulating absence of 27 anthropogenic dispersal barriers); and 'artificial dispersal' within the 'unconnected 28 envelope' (ie. separated by natural physical barriers). Analysing projected range change 29 in African antelopes by 2080, translocation across natural dispersal barriers was 30 31 associated with elevated potential for interspecific competition with allopatric species and hence possible interference with ecosystem function. We argue that where 32 translocation within the indigenous range is not an option, priority ranking of release 33 sites would benefit from explicit consideration of dispersal barriers, favouring projected 34 novel ranges above areas separated by distance and, especially, natural physical 35 obstacles. 36

37 KEYWORDS: Assisted migration; Habitat fragmentation; Invasive species;
38 Reintroduction; Species distribution modelling; Mammals.

39 1. INTRODUCTION

40 Translocation has been used as a conservation tool for more than a century in order to reverse species declines caused by human activities (Griffith et al., 1989; Seddon et al., 2007; Ewen 41 et al., 2012). Although translocation is often a compelling solution for species facing a high 42 risk of extinction in the wild, its implementation is far from straightforward: it is an 43 intervention that by definition interferes with natural ecological and evolutionary processes, 44 the maintenance of which is the very goal of conservation. Over the past decade, 45 translocation has received broad interest as a means of adapting to human-induced climate 46 change for species that are unable to track habitat changes in fragmented landscapes (Harris 47 48 et al., 2006; Hunter, 2007; Seddon, 2010; Sansilvestri et al., 2015). Still, the need remains for a systematic framework that prioritizes options for translocation according to their 49 compatibility with natural eco-evolutionary processes in a world where climate change itself 50 51 is changing what may be considered a natural process (Parmesan, 2006).

52 As a starting point, the International Union for Conservation of Nature (IUCN) 53 Reintroduction Specialist Group (RSG), which was established in 1988 to promote best practice in conservation translocations, argues that translocation into indigenous areas, i.e. 54 'reintroduction', is generally preferable to translocation into non-indigenous areas, i.e. 55 'assisted colonisation' (IUCN/SSC, 2013). The justification is convincing: reintroductions 56 can be expected to entail relatively low risks because population restoration in this case is 57 supported by historical data on the performance of the species as a natural part of the 58 ecosystem. However, the IUCN RSG guidelines also point out that under some conditions the 59 60 non-indigenous area may in fact be more suitable for translocation than the indigenous range. Hence a wide range of potential threats faces species in the wild - including overexploitation, 61 land use changes, civil conflict, disease transmission, invasive aliens, pollution, as well as 62 63 climate change (IUCN, 2015) - and if the critical cause of a species' decline within its

64 indigenous range has not been identified and dealt with, reintroduction is unlikely to result in a stable, self-sustaining population. Even in cases where the threat that caused local 65 extinction is no longer present, a concern may be the subsequent emergence of new threats 66 67 within the indigenous range. Moreover, future threats, such as climate change, may sometimes be more likely to affect the indigenous range than climatically suitable parts of the 68 non-indigenous area. The IUCN RSG guidelines thus refer to assisted colonisation as the 69 70 solution of choice "where protection from current or likely future threats in current range is deemed less feasible than at alternative sites" (IUCN/SSC, 2013). However, the guidelines 71 72 point out that a "wide spectrum of operations" is currently covered by the term 'assisted colonisation' (IUCN/SSC, 2013). In this study, we view the highly heterogeneous area 73 74 potentially suitable for translocation release as a continuum in terms of the degree to which 75 translocation would mimic a likely natural change in space use under climate change.

76 How then can the likelihood of future distributional changes be estimated? When the climate induces habitat changes, the probability of a species colonising a given area will depend on 77 78 its species-specific dispersal ability and whether barriers to dispersal are present. Dispersal 79 barriers can be physical features of the natural world which make colonisation impossible, e.g. rivers, mountains, or intercepting hostile habitats and/or climate (Foden et al., 2008). 80 Alternatively, the barrier can be distance in which case colonisation may be expected 81 eventually, time being the crucial limiting factor. Also, barriers can be anthropogenic, e.g. 82 due to wildlife incompatible human land-use or infrastructural developments, such as roads, 83 fences or pipelines. From a conservation perspective, translocations across natural physical 84 barriers may be considered the most artificial and therefore least desirable. More compatible 85 with natural eco-evolutionary processes are translocations that speed up dispersal events 86 likely to occur naturally by traversing unoccupied expanses of suitable habitat at an 87

accelerated pace. Finally, translocations across anthropogenic barriers effectively restore
natural eco-evolutionary processes by overcoming artificial obstacles to dispersal.

Following this logic, we here propose a dispersal barrier-based framework for prioritizing 90 91 translocation release areas to protect natural eco-evolutionary processes under climate change. Taking as a prerequisite that conditions must remain bioclimatically suitable over the 92 relevant timeframe (Chauvenet et al., 2013), we define six translocation types corresponding 93 to six distinct translocation release zones that differ in the degree to which translocation 94 would approximate a natural event (Fig. 1): (i) 'Reinforcement' within the 'stable current 95 range'; (ii) 'Assisted dispersal sensu stricto' within the 'expected novel range'; (iii) 96 'Compensatory dispersal' within the 'idealized novel range' (ie. the range projected only if 97 simulating the absence of anthropogenic dispersal barriers); (iv) 'Accelerated dispersal' 98 within the 'expected connected envelope' (ie. the part of the bioclimatic envelope beyond 99 dispersal range); (v) 'Accelerated compensatory dispersal' within the 'idealized connected 100 envelope' (ie. the unreachable, connected envelope projected only if simulating the absence 101 102 of anthropogenic dispersal barriers); and (vi) 'Artificial dispersal' within the 'unconnected 103 envelope' (ie. the part of the bioclimatic envelope that is spatiotemporally separated from the current range by natural physical barriers). 104

As our empirical model, we focus on African antelopes, a group expected to be significantly 105 affected by future climate change (Payne and Bro-Jørgensen, 2016), and of which 23% of the 106 species are already listed as threatened on the IUCN Red List (IUCN 2015). Translocation 107 has a particularly strong history as a conservation tool in ungulates, from the first 108 109 conservation translocation ever which targeted the American bison (Bison bison) in 1907 (Kleiman 1989), through several subsequent successful reintroductions, for example of the 110 Arabian oryx (Oryx leucoryx) in the 1980s (resulting in down-listing from 'extinct in the 111 112 wild' to 'vulnerable'; Stanley Price, 2016), to today's efforts to restore populations of the wild-extinct scimitar-horned oryx (*Oryx dammah*) within its former range (Woodfine and Gilbert, 2016). Our study is thus intended also to address a more specific urgent challenge to conservation. To delimit translocation release zones for our empirical study system, we project spatial responses of species and their habitats to climate change using species distribution models (SDMs) with the critical timeframe set to 2080, the time horizon of the climate forecasts (IPCC, 2015).

Though we advocate for the ecological changes expected under climate change to be 119 incorporated more firmly into translocation guidelines, we also agree that translocation 120 initiatives should aim to retain current ecosystem structure as far as possible to avoid 121 functional perturbation (IUCN/SSC, 2013), especially considering the uncertainty inherent in 122 forecasting future species distributions (Synes and Osborne, 2011). A particular concern is 123 the introduction of previously allopatric species, which can trigger unprecedented ecological 124 125 processes with potentially devastating consequences; in particular, competitive exclusion can lead to both extinction of indigenous species where introduced species behave invasively 126 127 (e.g. the extinction of the thylacine Thylacinus cynocephalus following introduction of domestic dogs Canis lupus familiaris; IUCN, 2015) and establishment failure of introduced 128 populations where the indigenous species are the stronger competitors (e.g. the failure of 129 introduced roan antelope Hippotragus equinus to become established in the ungulate 130 community in Shimba Hills National Park, Kenya; Schiøtz, 1987). The risk of ecological 131 interference in this case increases with the dietary overlap between species, which can 132 promote unnatural interspecific competition. By contrast, interspecific competition between 133 naturally sympatric species is an integral component of natural ecosystem function, where 134 stable coexistence is evidenced by historical data. To assess the extent to which our 135 classification system captures differences between translocation release zones in the 136 similarity of community structure to current ranges, we compare zones within our empirical 137

model system in terms of the projected occurrence of currently allopatric antelope species aswell as the degree of dietary niche overlap with these.

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141 2. MATERIALS AND METHODS

142 2.1. Species distribution modelling

The study used the 73 extant African antelope species as an empirical model. Current species 143 distributions, represented by Esri shape files rasterised to 10' grid scale, were modelled as 144 quadratic generalised linear models (GLM) in the R package BIOMOD (Thuiller et al., 145 2009). Distributions were derived from Extent Of Occurrence (EOO) ranges reported by 146 IUCN (IUCN 2015), approximating the 'Area Of Occupancy' (AOO) by removing areas 147 148 from which species were assumed *a priori* to be absent due to human land-use (coded in both 149 a 'human footprint'-filter; Sanderson et al., 2002; Thuiller et al., 2006; and a habitat-filter; USGS, 1999) and, for open- and closed-habitat specialists only, incompatible natural habitat 150 (coded in the habitat-filter; USGS, 1999). The habitat-filter categorized land cover as either 151 open (i.e. grassland, savannah, open woodland), closed (i.e. forests), or human-dominated 152 (i.e. built up areas, cropland) (USGS, 1999). The 'human footprint'-filter reduced the 153 154 predicted probability of species occurring in areas under human impact by incorporating data on population density, land transformation, accessibility, and electrical power infrastructure 155 156 (Sanderson et al., 2002); specifically, the initial probability (IP) of occurrence from the SDM was weighted by the 'human footprint' (HFP) to provide a final probability (FP) for each 157 grid cell: $FP_i = IP_i \times HFP_i$, where *i* is a 10' grid cell (Thuiller et al., 2006). 158

Predictive variables were selected from 34 environmental variables relating to climate, topography, land cover, and soil (see online supplementary material). Climate data were obtained from WorldClim (Hijmans et al., 2005), and the distributional information was 162 related to climatic conditions between 1950 and 2000. Since covariation precluded their simultaneous inclusion in the models, variables were ranked by variable importance 163 assessment following Thuiller et al. (2010), and principal component analysis was performed 164 to detect collinearity; on this basis, we selected the set of mutually independent variables with 165 the highest explanatory power. In parallel with Pigot et al. (2010), this approach resulted in 166 the inclusion of annual precipitation (log), and hottest and coldest monthly temperature as 167 explanatory factors. SDMs informed by a random data sample (70%) were selected according 168 to their Akaike Information Criterion scores (using the stepwise search function stepAIC, 169 170 direction: "both"; Thuiller et al., 2003) and subsequently evaluated against the remaining 30% of the data. For assessment, we calculated both True Skills Statistics (TSS) (Landis and 171 Koch, 1977; Allouche et al., 2006; Eskildsen et al., 2013) and Area Under the Curve (AUC) 172 173 values, sensitivity, and specificity (Swets, 1988). Using TSS, model accuracy was classified as 'excellent' for 65 species (TSS>0.75) and 'good' (0.75>TSS>0.4) for the remaining eight 174 (Fig. S1), and using AUC, as 'high' (AUC>0.9) for 70 species and 'useful' (0.9>AUC>0.7) 175 for the remaining three (Fig. S1; Fig. S2). 176

Next, SDMs were used to predict future ranges based on climate projections for three 177 different Atmosphere-Ocean Global Circulation Models (AOGCMs), i.e. UKMO HADCM3, 178 NCAR CCSM3 and BCCR BCM2, and the moderate A1B greenhouse gas emission storyline 179 (IPCC, 2015). Multi-climate-model ensemble forecasts defined areas with concordant 180 predictions under at least two of the three AOGCMs climate models (Payne and Bro-181 Jørgensen, 2016). Future bioclimatic envelopes were delimited as the area predicted to have 182 suitable climatic conditions according to the SDMs. The bioclimatic envelopes were 183 subdivided according to whether or not an area was spatiotemporally connected to the current 184 range by suitable habitat; intermediate time steps for assessing connectivity were 2030 and 185 2050. 186

Based on the bioclimatic envelopes, we projected species distributions in 2080 by assuming that species will disappear from climatically unsuitable habitat and expand into climatically suitable habitat connected to their current range. Species-specific dispersal velocities were calculated as the yearly dispersal distance (km) for an herbivore, D_{Herb} , according to Schloss et al. (2012):

$$D_{Herb} = 1.45 * M^{0.54}$$

where M is body mass (kg) which we obtained from Jarman (1974), Gagnon and Chew 192 (2000) and Bro-Jørgensen (2007; 2008). The dynamics leading to future species ranges were 193 modelled in two ways. A 'realistic' approach was used to project the 'expected' ranges by 194 applying the 'human footprint'- and habitat-filters to the forecasts to reduce the likelihood of 195 species dispersing into areas dominated by human land-use (USGS, 1999; Sanderson et al., 196 2002; Thuiller et al., 2006) and, for habitat specialists, incompatible natural habitat (USGS, 197 1999). A 'hypothetical' approach was used to simulate natural dynamics in an 'idealized' 198 199 world without impact from modern man. Here the 'human footprint'-filter (Sanderson et al., 2002) was removed and the habitat-filter (USGS, 1999) was applied only to habitat 200 specialists to remove areas with incompatible natural habitat; due to uncertainty regarding the 201 202 natural habitat of human-dominated landscapes, we took a liberal approach assuming that both open and closed habitat specialists might have been able to disperse through these areas 203 204 in the absence of man (for example, on the dynamic state between savannahs and forests, see Parr et al., 2014). Note, that the human land-use filters were still applied as a final step to the 205 'idealized' projections in order to remove areas with inappropriate land cover from 206 consideration as release areas. Areas in grid cells were converted to km² by applying an 207 algorithm accounting for latitudinal variation in the extent of grid cells (Burrows et al., 2011). 208

209 Based on the SDMs, we defined species as particularly threatened by climate change if they satisfied any of the following criteria: (i) an elevated threat status was predicted for 2080 due 210 to (a) projected population decline rate (estimated from range size, following IUCN criteria 211 A3c; IUCN, 2015) and/or (b) reduction in the absolute range size (IUCN criteria B2; IUCN, 212 2015), and/or (ii) the range in 2080 was projected to fall entirely outside the protected area 213 network as reported by the IUCN/United Nations Environment Programme (UNEP) World 214 Database on Protected Areas (including only protected areas assigned an IUCN category I-215 VI; UNEP-WCMC, 2012). 216

217 The models were generated and analysed in R (R Development Core Team, 2014).

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219 2.2. Ecological assessment of translocation release zones

For each species, we determined for every cell within its total potential translocation release area: (i) the number of currently allopatric antelope species projected to be present by 2080, and (ii) its mean dietary niche overlap with these. For each species, we then calculated the mean of these two indices for each of the six translocation release zones. The dietary niche overlap was calculated as the Pianka index O_{jk} for a focal species (*j*) against all allopatric antelope species (*k*) within a given cell (Pianka, 1973):

$$O_{jk} = \frac{\sum_{i=1}^{n} p_{ki} p_{ji}}{\sqrt{\sum_{i=1}^{n} (p_{ki}^2) (p_{ji}^2)}}$$

where p refers to the proportion of each resource type i in the diet, with resource types categorized into fruit, browse, and grass based on Gagnon and Chew (2000) and Cerling et al. (2003). The Pianka index ranges from 0 (no overlap with any species) and 1 (complete overlap with all species). For both indices, we compared differences between translocation release zones in Kruskal-Wallis tests with Bonferroni-corrected post-hoc tests using SPSS
version 22 (IBM, Armonk, NY, U.S.A.).

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233 **3. RESULTS**

234 *3.1.Distribution of translocation release zones*

Table 1 shows the division of the area projected as suitable for translocation release of 235 African antelopes (i.e. with stable, suitable environmental conditions until 2080) into the six 236 translocation release zones based on the separation from current species ranges by 237 anthropogenic and natural dispersal barriers. Examples of the spatial distribution of these 238 zones for individual species are shown in Fig. 2. On average, a 43.8% decline in the current 239 ranges of African antelopes was predicted by 2080. However, for most species, a 240 241 considerable area suitable for conservation translocation was found elsewhere, on average equivalent to 162.6% of the current species range. On average, around half of this area was 242 cut off from the current range by natural barriers ('unconnected envelope'), but more than a 243 third was within the 'expected novel ranges' due to natural dispersal; the extent of the 244 connected bioclimatic envelope beyond reach by dispersal ('expected connected envelope') 245 and areas separated by anthropogenic barriers ('idealized novel ranges' and 'idealized 246 connected envelope') were relatively modest (Table 1). Large standard errors indicate that 247 individual species differed drastically in the potential importance of the different zones for 248 their conservation; for details pertaining to the species most threatened by climate change, see 249 250 sec. 3.3.

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252 *3.2. Ecological assessment of translocation release zones*

253 The projected occurrence of allopatric antelope species by 2080 differed between translocation release zones (Kruskal-Wallis: df 5, H=44.03, P<0.001; Fig. 3a). Post-hoc tests 254 showed that significantly more allopatric antelope species were projected to be present in the 255 256 unconnected envelope than in the stable current range (P<0.001) and the expected and idealized novel ranges (both P=0.001); also the expected and idealized connected envelopes 257 were projected to have more allopatric species than the stable current range (P=0.002 and 258 P=0.015 respectively). Moreover, average dietary niche overlap with allopatric species 259 differed between translocation release zones (Kruskal-Wallis: df 5, H=15.25, P=0.009; Fig. 260 261 3b). Post-hoc tests showed that the overlap within the unconnected envelope was significantly higher than within the stable current range (P=0.021). 262

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264 *3.3.Translocation options for species most threatened by climate change*

Fourteen African antelope species were identified as particularly threatened by climate change based on the models (Table 1 and 2). Nine qualified due to projected population decline (IUCN criteria A3c), nine due to small range (IUCN criteria B2) and five because their projected ranges showed no overlap with the protected area network (Table 2). The species showed contrasting patterns in the relative importance of the various translocation release zones; percentages in brackets in the remainder of this section refer to the area of a zone relative the species' current range.

For the hirola (*Beatragus hunteri*) (critically endangered, CR) and the Nile lechwe (*Kobus megaceros*) (endangered, EN), the areas with suitable conditions at present and by 2080 showed no overlap and hence no suitable release areas were identified. For the Aders' duiker (*Cephalophus adersi*) (CR), only a small area within the unconnected envelope, of similar size to the current range, was identified as suitable for release by the forecasts. The addax

277 (Addax nasomaculatus) (CR) was predicted to depend on accelerated dispersal to its expected connected envelope (131%), and potentially on accelerated compensatory dispersal to a 278 similar-sized area within the idealized connected envelope (113%). The dibatag 279 280 (Ammodorcas clarkei) (vulnerable, VU) was predicted to decline drastically, by 98%, within its current range and depend heavily on natural dispersal into the expected novel range 281 (52%), pointing to assisted dispersal sensu stricto as a conservation option. Peters' duiker 282 (Cephalophus callipygus) (least concern, LC) and the white-bellied duiker (Cephalophus 283 *leucogaster*) (LC) were both predicted to undergo 86% decline within their current ranges. Of 284 285 their potential translocation release areas, 7.1% resp. 11% were situated within their expected novel ranges, and only 1.1% resp. 2.7% within their idealized novel ranges, suggesting 286 limited options for assisted and compensatory dispersal. Expected connected envelopes were 287 288 projected to cover 24% resp. 11% of the potential translocation release area, which points to the feasibility of accelerated dispersal. Jentink's duiker (Cephalophus jentinki) (EN) and 289 Abbott's duiker (Cephalophus spadix) (EN) were forecast to decline by 48% resp. 50% 290 291 within their already restricted ranges; with only modest natural dispersal into expected novel ranges (14% resp. 19%), artificial dispersal into the relatively extensive unconnected 292 envelopes projected could become necessary (624% resp. 1,555%), although for the Abbott's 293 duiker also the preferred option of compensatory dispersal would be realistic with a 294 considerable idealized novel range (19%). The beira (Dorcatragus megalotis) (VU) and 295 296 Speke's gazelle (Gazella spekei) (EN), which were predicted to undergo more modest declines of 33% resp. 18% within their current ranges, were expected to increase their ranges 297 significantly by natural dispersal (expected novel range: 815% resp. 69%); assisted dispersal 298 299 sensu stricto would therefore be preferable to artificial dispersal if translocation were to become necessary. Piacentini's dikdik (Madoqua piacentinii) (data deficient, DD) was 300 expected to show a drastic range decline of 87%, and the only significant translocation option 301

302 suggested by the projections was assisted dispersal sensu stricto which could bolster the natural dispersal into expected novel range (17%). A similar situation was predicted for the 303 dama gazelle (Nanger dama) (CR) for which a 96% decline in the current range was 304 305 accompanied by a significant gain of expected novel range (50%); in this case the expected connected envelope (26%) also suggests scope for accelerated dispersal. Finally, the current 306 range of the mountain nyala (Tragelaphus buxtoni) (EN) was projected to decline by 40%, 307 but gain of expected novel range (67%) was considerable and artificial dispersal into the 308 unconnected envelope (277%) may thus not be desirable. 309

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311 4. DISCUSSION

Where assisted colonisation is contemplated as a conservation solution, the systematic 312 313 dispersal barrier-based approach presented here offers both a conceptual and a practical framework for prioritizing potential release areas according to their compatibility with natural 314 ecological processes in a changing world (Mouquet et al., 2015). A major strength of the 315 framework is that it assumes a dynamic worldview, explicitly acknowledging change as a 316 fundamental part of ecosystems (Choi, 2007). Thereby it adds precision to the current 317 translocation terminology which is centred on a dichotomy between 'reintroductions' within 318 the indigenous area and 'assisted colonisations' anywhere else (Hallfors et al., 2014). Whilst 319 320 this dichotomy is important, it is essentially based on a static worldview, and we believe that 321 our reference system can promote more effective communication regarding the management 322 of dynamic landscapes.

323 Our approach is intended to complement, rather than replace, a historical management 324 approach based on the concept of 'indigenous range'. We thus recommend that potential 325 release areas are assessed by evaluating the distribution of the translocation release zones

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326 together with any information available on the extent of historical ranges. Sites within the indigenous range should be preferred wherever possible, and especially the 'expected novel 327 range' will often include both indigenous and non-indigenous areas. Our framework 328 329 specifically offers a way around the notorious challenge of defining the critical time period since local extinction beyond which the historical range should no longer considered 330 indigenous: a key factor in this regard is the speed of environmental change, and our model 331 incorporates this by removing the part of the historical range that is no longer climatically 332 suitable. 333

Our modelling framework provides scope for further sophistication in support of 334 335 conservation planning. The current models approximate the fundamental Grinellian niche of species and may be less accurate in reflecting the realized Eltonian niche which also includes 336 interspecific interactions (Soberon, 2007; Devictor et al., 2010). In our empirical model, the 337 338 higher occurrence of allopatric species, and the higher dietary overlap with these, in the unconnected envelope compared to the stable current range suggests that the potential for 339 340 competition with allopatric competitors to affect the realized niche is of particular concern if 341 release areas are separated from current ranges by natural physical dispersal barriers. The higher dietary niche overlap in this case is interesting in that it suggests that communities in 342 the unconnected envelope are more likely to have evolved to include allopatric species that 343 occupy similar ecological niches to the focal species. The results moreover suggest that 344 compared to the stable current range, the occurrence of allopatric species is significantly 345 higher also in the connected envelope, but not in the projected novel range; the ecological 346 similarity suggested by the lack of significant difference between the expected and idealized 347 novel range in particular may be due to the fact that anthropogenic barriers are too recent to 348 have had detectable consequences for community structure. Overall, these findings indicate 349 that our classification framework at least to some extent captures the ecological impact of 350

dispersal barriers on the degree of similarity in community structure and possibly also function. A valuable next step, however, would be to express the impact of interspecific interactions explicitly in the species distribution models; in particular, it may allow identification of species likely to behave invasively (Blackburn et al., 2011), which is a main concern in relation to translocation release in non-indigenous areas (Chauvenet et al., 2013).

Other priorities for model improvement include the development of more realistic land-cover 356 357 filters that are dynamic rather than static. Especially, incorporation of pressures from nonclimatic threats such as overexploitation would enhance the accuracy of projections for the 358 species whose current ranges have been severely affected by these threats: at present, their 359 360 bioclimatic envelopes are likely to be underestimated and should be interpreted cautiously. As more data on local species densities become available, it will also increasingly become an 361 option to model species abundance rather than distribution and generate projections at finer 362 spatial and temporal resolution. 363

364 For antelope biodiversity, the present study suggests that considerable distributional changes 365 may be expected over the decades to come. For many species, conditions in significant parts of their current range are projected to deteriorate while new habitat is expected to become 366 367 available in adjacent areas. As they stand, our results indicate that dispersal ability may not be a major limiting factor for antelopes in general within the timeframe considered: overall, 368 species were projected to spread naturally into most of the suitable areas opening up (i.e. the 369 expected connected envelope was markedly smaller than the expected novel range). Our 370 results also suggest that although human land-use significantly reduces the areas available for 371 372 translocation release, it may have a limited effect on the ability of species to disperse into the areas remaining (cfr. idealized versus expected projections in Table 1). However, the impact 373 of man-made obstructions may have been underestimated due to lack of continent-wide 374 375 information on the distribution of fences within wilderness areas. Although most fences

erected to reduce human-wildlife conflicts separate areas with human land-use from wilderness areas (Durant et al., 2015), their effect thus approximated by our human land-use filters, fences are also sometimes erected *within* wilderness areas, notably bordering protected areas, private land, countries and roads, and/or for veterinary reasons (Durant et al., 2015). Such fences can have profound ecological consequences which are not accounted for in this study, and we stress the need for large-scale databases on the distribution of fences within wilderness areas to inform ecological modelling for conservation management.

For practical conservation, averages across species are of course frequently less relevant than the often drastic differences in projections between species. While it is also here important to recognize that species distribution modelling can be associated with a considerable degree of uncertainty (Synes and Osborne, 2011), the specific results pertaining to individual species in this study still provide a useful initial assessment pointing to cases of concern for further evaluation.

389 What will be the role of assisted colonisations in the future? Given the present combination 390 of drastic climate change and progressive habitat fragmentation, a logical expectation is not only that translocation will become more important as a conservation intervention, but also 391 392 that the non-indigenous area will become increasingly relevant in this regard. However, the warning of Ricciardi and Simberloff (2009), that our knowledge of ecosystem function is 393 generally too limited to advocate translocation outside indigenous ranges, remains sobering. 394 Since the effect on both the genetic and ecological balance is difficult to predict, it may be 395 argued that, according to the precautionary principle, assisted colonisations should only ever 396 397 be considered as a very last resort to restore natural populations. Regardless of the viewpoint taken on assisted colonisations, when they do take place, it is crucial that the selection of 398 translocation release sites is based on rigorous evaluation of the likely future changes in 399 400 species distributions. To this end, we strongly recommend increased integration of projective

401 species distribution modelling into translocation planning and propose our dispersal barrier-402 based framework as a tool in the assessment.

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529 Table 1 Relative extent of translocation release zones for African antelope species.

Translocation release zone	Dispersal barrier	Translocation type	Area relative to current range		Area in proportion of total area		
			(mean±SEM)		suitable for translocation		
					(mean±SEM)		
			All	CC-threatened ¹	All	CC-threatened ¹	
			(N=73 spp)	(N=14 spp)	(N=71 spp) ²	(N=12 spp) ²	
Stable current range	None	Reinforcement	56.2±3.2%	25.6±7.9%	49.3±3.4%	20.9±7.7%	
Expected novel range	None	Assisted dispersal sensu stricto	58.9±14.5%	79.1±57.0	25.7±2.4%	25.5±8.6%	
Idealized novel range	Man-made	Compensatory dispersal	5.0±1.5%	2.1±1.4%	2.1±0.4%	0.7±0.3%	
Expected connected envelope	Distance	Accelerated dispersal	9.9±3.4%	14.0±9.4%	4.8±1.2%	10.4±5.0%	
Idealized connected envelope	Man-made &	Accelerated compensatory	5.7±2.3%	8.1±8.1%	3.0±1.1%	3.8±3.8%	
	distance	dispersal					
Unconnected envelope	Natural physical	Artificial dispersal	83.1±32.4%	295.9±145.8%	15.1±2.8%	38.4±12.1%	

¹'Climate change-threatened', see sec. 2.1.

⁵³¹ ²Reduced sample size due to lack of potential release areas projected for the hirola *Beatragus hunteri* and Nile lechwe *Kobus megaceros*.

532 Table 2 Absolute extent of translocation release zones for individual species particularly threatened by climate change.

Species	Current range	Translocation release zone (km ²)						
	(km ²)	Stable	Expected	Idealized	Expected	Idealized connected	Unconnected	
		current range	novel	novel range	connected	envelope	envelope	
			range		envelope			
Addax (Ad	<i>Idax</i> 32,272	0	324	323	42,430	36,449	322	
nasomaculatus) ^{1,2}								
Dibatag (Ammodo	<i>rcas</i> 83,250	1,695	43,344	0	0	0	1,643	
clarkei) ^{1,2,3}								
Hirola (Beatragus hunteri) ^{1,2}	2 11,280	0	0	0	0	0	0	
Aders' duiker (Cephalop	phus 342	0	0	0	0	0	341	
adersi) ^{1,2}								
Peters' duiker (Cephalop	ohus 703,408	100,105	10,569	1,700	35,860	0	681	
callipygus) ¹								

Jentink's duiker (Cephalophus	95,171						
<i>jentinki</i>) ³		49,297	13,217	1,346	0	0	593,435
White-bellied duiker (<i>Cephalophus leucogaster</i>) ³	1,185,476	161,618	22,528	5,786	22,788	0	1,363
Abbott's duiker (<i>Cephalophus</i> spadix) ²	5,437	2,725	1,023	1,024	1,689	0	84,552
Beira (Dorcatragus megalotis) ³	38,332	25,553	312,425	2,385	0	0	567,203
Speke's gazelle (<i>Gazella</i> spekei) ³	154,508	127,413	107,044	0	0	0	160,834
Nile lechwe (Kobus megaceros) ^{1,2}	108,911	0	0	0	0	0	0
Piacentini's dikdik (Madoqua piacentinii) ^{1,2,3}	34,082	4,425	5,767	342	342	0	341
Dama gazelle (<i>Nanger dama</i>) ^{1,2}	273,206	11,695	136,738	0	69,950	0	0

Mountain	nyala	(Tragelaphus	5,087	3,055	3,393	0	0	0	14,073
<i>buxtoni</i>) ²									

¹Threatened due to population decline. ²Threatened due to small range. ³Threatened due to lack of protection.

Figure 1. Schematic representation of the translocation release zones in relation to dispersalbarriers.

Figure 2. Translocation release zones for six selected antelopes assessed against a 2080-time
horizon. The solid outline indicates the extent of occurrence reported by the IUCN; note the
current range is smaller due to application of land-cover filters. (Addax: Addax *nasomacultus*; Salt's dikdik: Madoqua saltiana; dibatag: Ammodorcas clarkei; bay duiker: *Cephalophus dorsalis*; suni: Nesotragus moschatus; Cape grysbok: Raphicerus melanotis).

542

Figure 3. (a) Occurrence of allopatric antelope species according to translocation release 543 zone (mean number per cell). (b) Dietary niche overlap with allopatric antelope species 544 according to translocation release zone (mean of the mean Pianka index per cell). Boxes 545 delimit the interquartile ranges (IQR, i.e. the 2nd and 3rd quartiles), with horizontal lines 546 indicating the median, whiskers delimit values within 1.5 IQR from the 1st and 3rd quartiles, 547 and circles indicate outliers. Numbers above the graphics refer to sample sizes; these are <73 548 because all translocation release zones were not represented in all species and, if present, did 549 not always contain allopatric species. Significant differences between translocation release 550 zones in post-hoc tests are shown (***P<0.001; **P<0.01; *P<0.05). 551







557 Figure 3a



559 560 Figure