1 Comparing management strategies for conserving communities of climate-threatened species with a

- 2 stochastic metacommunity model
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- 6
- 7 Abstract

8 Many species are shifting their ranges to keep pace with climate change, but habitat fragmentation and 9 limited dispersal could impede these range shifts. In the case of climate-vulnerable foundation species 10 such as tropical reef corals and temperate forest trees, such limitations might put entire communities at 11 risk of extinction. Restoring connectivity through corridors, stepping-stones, or enhanced quality of 12 existing patches could prevent the extinction of several species, but dispersal-limited species might not 13 benefit if other species block their dispersal. Alternatively, managers might relocate vulnerable species 14 between habitats through assisted migration, but this is generally a species-by-species approach. To 15 evaluate the relative efficacy of these strategies, we simulated the climate-tracking of species in randomized competitive metacommunities with alternative management interventions. We found that 16 17 corridors and assisted migration were the most effective strategies at reducing extinction. Assisted 18 migration was especially effective at reducing the extinction likelihood for short-dispersing species, but 19 it often required moving several species repeatedly. Assisted migration was more effective at reducing 20 extinction in environments with higher stochasticity, and corridors were more effective at reducing 21 extinction in environments with lower stochasticity. We discuss the application of these approaches to 22 an array of systems ranging from tropical corals to temperate forests.

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24

25 Introduction

26 The projected rate of climate change threatens many species, especially dispersal-limited 27 species (Urban 2015). Habitat fragmentation intensifies this risk by causing the additional impediment of 28 needing to disperse over poor-quality habitat (Krosby et al. 2010). Moreover, when competing species 29 track climate change at differential speeds, faster dispersing species can block slower dispersing species 30 from tracking climate change (Urban et al. 2012). Such impediments can have ecosystem-wide 31 consequences when dispersal-limited species serve as foundation species, such as in forests (Honnay et 32 al. 2002) and tropical coral reefs (Munday et al. 2009). Though many coral reef species can disperse far 33 in their larval stage, differential dispersal ability and fragmentation could mean that some species are 34 unable to keep pace with climate change (Gaines et al. 2007; Munday et al. 2009). Similarly, competition 35 and the differential effects of climate change on tree species means that poleward species might 36 prevent equatorward species from tracking climate change, especially over fragmented landscapes 37 (Scheller & Mladenoff 2008).

38 One potential method of conserving dispersal-limited species is through assisted migration, or 39 the relocation of populations outside of the species' historical range to areas that will be more suitable 40 in response to climate change (McLachlan et al. 2007; Hoegh-Guldberg et al. 2008). Despite a long 41 history of conservation translocations within a species' historical range (Seddon et al. 2007), relocating a 42 species to a new area with novel species interactions could pose additional challenges. With little 43 precedent and high uncertainty, relocated populations could become invasive or spread diseases and 44 parasites (Mueller & Hellmann 2008; Ricciardi & Simberloff 2009). Even translocations within a species' 45 range are often unsuccessful without the additional complications of novel competitors, climate change, 46 and fragmentation (Fischer & Lindenmayer 2000; Bubac et al. 2019). To limit relocation failure, decision-47 making frameworks for assisted migration generally seek to understand the uncertainty around the 48 optimal time and place to move a vulnerable species (McDonald-Madden et al. 2011). However, assisted 49 migration might have limited success when relocating species with narrow climate tolerance into 50 environments with high climate variability over time or low climate variability over space. Additionally, 51 assisted migration is often a single-species approach (Lawler & Olden 2011) that addresses the 52 symptoms of extinction risk instead of the root causes (e.g., habitat fragmentation; Fazey & Fischer 53 2009; Minteer & Collins 2010). Despite potential risks and uncertainties, assisted migration is already 54 underway for several species at risk of extinction (Liu et al. 2012; Seddon et al. 2015; Wang et al. 2019) 55 and some variations of assisted migration are being tested in coral reefs (van Oppen et al. 2014; Kuffner 56 et al. 2020) and trees (Sáenz-Romero et al. 2021). 57 Alternatively, habitat restoration in and between fragmented habitats could assist the natural

58 dispersal of species that would otherwise be unable to track climate change (Lawler & Olden 2011).

59 Building habitat corridors (Beier & Noss 1998; Haddad et al. 2015) or stepping-stones reserves

60 (McDowell et al. 1991; Treml et al. 2008) might help increase connectivity and decrease extinction risk

61 from climate change (Robillard et al. 2015), and additional protection of existing reserves might bolster

62 source populations to increase overall persistence (Heller and Zavaleta 2009). Unlike the single-species

63 focus of assisted migration, increasing habitat protection or connectivity is a community-level approach

64 that could directly benefit multiple species that might otherwise be unable to disperse between

65 fragmented patches (Lawler & Olden 2011). However, increasing connectivity and habitat protection do

66 not specifically target species disproportionally affected by climate change, where biological limitations

67 in dispersal ability and negative effects of community interactions could prevent climate tracking

68 (Gilman et al. 2010; Urban et al. 2012). Among the restoration options, those that increase connectivity

69 inherently increase available habitat area, which could be critical for declining populations at risk of

70 extinction from climate change (Hodgson et al. 2009). While increasing connectivity typically has a

smaller effect on population outcomes than increasing protection or patch size, or reducing overall

habitat loss, in conservation generally (Harrison & Bruna 1999; Fahrig 2001; Falcy & Estades 2007),

73 increasing connectivity might have a greater impact when considering range shift dynamics under 74 climate change (Nuñez et al. 2013). Like assisted migration, the effectiveness of connectivity and 75 restoration-based approaches at conserving species can depend on spatio-temporal variability, as 76 stochasticity in connectivity can reduce species' persistence (Watson et al. 2012) while heterogeneity in 77 microclimates can increase persistence through climate change (Suggitt et al 2018). As an example of a 78 connectivity-based approach, protecting a marine reserve network focused on connectivity between 79 locations with different levels of temperature stress is one proposed approach to buffer coral reef 80 response to climate change (Mumby et al. 2011; Walsworth et al. 2019). For forest trees, connectivity 81 and restoration would involve creating large-scale networks of land-sharing or land-sparing between 82 disconnected forests (Fischer et al. 2014) or working with local landowners to encourage practices that 83 reduce barriers and promote species persistence (Krosby et al. 2010). 84 Given the potential trade-offs to each approach, we compare the relative efficacy of these 85 alternative management strategies to support species responses to climate change. To understand how 86 these strategies compare under a variety of conditions in terms of spatio-temporal climate variability, 87 we built a metacommunity model that simulates climate tracking of several randomized species 88 competing in a fragmented environment over a temperature gradient through a cycle of reproduction, 89 dispersal, and competition. Using this model, we compared a variety of management strategies to 90 conserve species' persistence and diversity: assisted migration, building habitat corridors, creating 91 stepping-stone reserves, and reinforcing areas that currently had high habitat quality.

92

93 Methods

94To compare the potential for various conservation strategies to reduce extinction in95environments under different spatio-temporal conditions, we modeled metacommunity dynamics of

96	species competing on a one-dimensional linear temperature gradient subjected to climate change.
97	Building on the models by Backus & Baskett (2021) and Urban et al. (2012), all species in this
98	metacommunity compete for the same resources on the same trophic level; we focus on competition as
99	the central interspecific interaction because of its role in range limits (Connell 1972, Sexton et al. 2009)
100	and range shifts. Each species i has a discrete population size $n_i(x, y, t)$ that changes with time t and
101	space on both the large x and local scale y . All populations cycle through reproduction, dispersal, and
102	competition, each with demographic stochasticity. Each species has a unique thermal optimum ζ_i ,
103	dispersal distance γ_i , thermal tolerance breadth σ_i , and reproductive strength $ ho_i$. The carrying capacity
104	K(x, y) varies over space to represent high- and low-quality habitat. After simulating metacommunity
105	dynamics with climate change, we compared extinction rates under each approach. Then we focused on
106	comparing corridors to assisted migration for different levels of environmental stochasticity and local
107	heterogeneity, and finally we analyzed the species characteristics associated with protection by each
108	approach.

109

110 Climate variability and change

111 We represent local temperature variation across space with the local climate heterogeneity 112 parameter, *H*. Space in this model is a one-dimensional temperature gradient of *L* patches, representing 113 large-scale latitudinal or elevational change (Urban et al. 2012). Each patch $x \in X$ has *W* subpatches, 114 representing small-scale variability in microclimates without an explicit spatial structure. Each local 115 subpatch $y \in Y$ temperature has T(x, y, t) with a mean patch temperature of $\overline{T}(x, t) = \sum_{y=1}^{W} T(x, y, t)$ 116 at time *t*. We set the local climate heterogeneity such that each patch has a standard deviation in local 117 temperatures of

$$H = \sqrt{\frac{\sum_{y=1}^{Y} (T(x, y, t) - \bar{T}(x, t))}{W - 1}}.$$
(1)

118

119 Temperature increases linearly over time with environmental stochasticity, *S*, representing the 120 magnitude of interannual variation in temperature across the environment. At the beginning of each 121 time step, all patches simultaneously increase in temperature by an average value of τ , with a stochastic 122 component with autocorrelation κ , and standard deviation *S* around white noise $\omega(t): \epsilon(t + 1) =$ 123 $\kappa \epsilon(t) + \omega(t)\sqrt{1 + \kappa^2}$, with the square root term to remove the effect of autocorrelation on the 124 variance (Wichmann et al. 2005). Altogether, the temperature in patch *x* changes over time is

$$T(x, y, t+1) = T(x, y, t) + \tau + S\epsilon(t).$$
(2)

125

126 *Metacommunity dynamics*

Each simulated species *i* has a population size population size of $n_i(x, y, t)$ individuals in patch *x*, subpatch *y* at discrete time *t*. All individuals reproduce simultaneously at the beginning of each time step with a reproductive output $b_i(T(x, y, t))$ as a function of time- and location-dependent temperature (Fig. 1a). Temperature-dependence is skew-normal, given skewness constant λ with the highest values around the species' thermal optimum ζ_i and a sharp decrease above ζ_i (Norberg 2004). Then given, thermal tolerance breadth σ_i and fecundity ρ_i , the reproductive output is

$$b_i(T(x, y, t)) = \exp\left(\rho_i\left\{\exp\left[-\left(\frac{T(x, y, t) - \zeta_i}{\sigma_i}\right)^2\right] \cdot \left[1 + \operatorname{erf}\left(\lambda \frac{T(x, y, t) - \zeta_i}{\sigma_i}\right)\right] - 1\right\}\right)$$
(3)

133 (Urban et al. 2012). To incorporate demographic stochasticity, the number of propagules produced by 134 individuals in patch x, subpatch y is a Poisson random variable with mean equal to the reproductive 135 output, $n_i^*(x, y, t) \sim \text{Poisson}\left(n_i(x, y, t) b_i(T(x, y, t))\right)$ (Melbourne & Hastings 2008).

136 Next, each propagule disperses from its origin (Fig. 1b). Though reproduction occurs within the 137 subpatch level, dispersal occurs at a larger spatial scale (between patches). Therefore, the model pools 138 together all propagules in a patch prior to dispersal, such that the total number of propagules in patch x 139 at time t is $N_i^*(x, t) = \sum_{y=1}^W n_i^*(x, y, t)$. We adapt the Laplace dispersal kernel to a discrete-space 140 analog, defining γ_i as the mean absolute distance (in patches) that individuals move from their origin 141 and let kernel parameter $q_i = \frac{\gamma_i + 1 - \sqrt{\gamma_i^2 + 1}}{\gamma_i}$. Thus, the probability of a propagule from patch x moving to

142 patch z is

$$k(x,z) = \left(\frac{q}{2-q}\right)(1-q)^{|x-z|}$$
(4)

143 (Backus & Baskett 2021). All propagules disperse from patch x throughout all patches with a 144 multinomial random vector. After arriving at patch z, propagules randomly distribute among the W145 subpatches of patch z. The resulting number of dispersed propagules in patch z, subpatch y, at time t is 146 $n_i^{**}(z, y, t)$.

Lastly, dispersed propagules compete for limited space and resources within each subpatch, given a location-dependent carrying capacity K(x, y) in each subpatch that remains constant over time (except when modified through management action) (Fig. 1c). The value of K(x, y) varies over space depending on the degree of habitat fragmentation. Density-dependent survival in this model is a variation on lottery competition (Sale 1978; Chesson & Warner 1981) with temperature dependence, with a higher chance of survival around a species thermal optimum ζ_i (Eq. 3). Altogether, each individual of species *i* has an equal probability of surviving,

$$p_i(x, y, t) = \left(1 + \frac{\sum_{j=1}^S b_j(x, y, t) n_j^{**}(x, y, t)}{b_i(x, y, t) K(x, y)}\right)^{-1}.$$
(5)

154

The total number of individuals that survive in patch x, subpatch y, after competition is a binomial random variable $n_i(x, y, t + 1)$ ~Binomial $\left(n_i^{**}(x, y, t), p(n_i^{**}(x, y, t))\right)$ (Melbourne & Hastings 2008).

158 Management interventions

We simulated six types of management strategies. Four of these strategies involved increasing the habitat quality in particular locations. To keep these strategies ecologically comparable, we increased the total carrying capacity by an amount defined as the "total area restored", *E*. We let $K_u(x, y)$ be the unmanaged carrying capacity of patch *x*, subpatch *y*, and $K_m(x, y)$ be the carrying capacity after management. Then the total area restored is $E = \sum_{x=1}^{L} \sum_{y=1}^{W} (K_m(x, y) - K_u(x, y))$.

164 With the "restore all" strategy, we increased the carrying capacity in all subpatches evenly by $\frac{E}{LW}$. With the "corridor establishment" strategy, we increased the carrying capacity in all locations that 165 166 were below a threshold carrying capacity and raised the minimum carrying capacity for all subpatches to 167 that threshold. We numerically adjusted this threshold until the total area was E. With the "stepping-168 stone" strategy, we first identified all locations below a threshold. For each region with multiple patches 169 below this threshold, we raised the carrying capacity for all subpatches in the middle 50% quantile of 170 the gap but left the outer 25% quantiles at initial values. We adjusted this threshold until the total area 171 restored was E. With the "reinforce" strategy, we increased the carrying capacity of all subpatches 172 above a threshold, adjusting until the total area was E.

Following Backus & Baskett (2021), we simulated assisted migration by relocating species when the total metapopulation of a species falls below a threshold of η individuals (Fig. 1f). After the population of a species *i* fell below η , we relocated a fraction of the population ϕ to a location with a temperature approximately equivalent the species thermal optimum ζ_i in the future. To find this, we

177	identified all locations with temperatures $ar{T}(x,t)\leq \zeta_i+0.2$. To avoid relocating a species into an area
178	with low habitat quality, we only relocated the population into locations that fit the above specifications
179	with $K(x, y) > 5$. We spread individuals between all subpatches within 5 patches (2 on either side of
180	the target location). After relocating a population, we did not relocate that species again for $lpha=5$ years
181	to avoid relocating a population recovering from a previous relocation. Following optimal parameter
182	values from Backus & Baskett (2021), we relocated ϕ of the total population and only μ survived
183	relocation (Table 1). To limit assisted migration (to be somewhat comparable to habitat quality
184	modification strategies), we only simulated relocations until we reached a maximum limit of F .
185	
186	Numerical implementation
187	For our simulations, we used parameter values from Table 1. We used $L = 512$ patches and
188	with $W = 8$ subpatches (a total of 2^{12} discrete locations). The initial mean temperature across the
189	temperature gradient varied linearly from the poleward edge to the equatorward edge. Annual
190	temporal autocorrelation was $\kappa,$ based on the measured combined global land-surface air and sea-
191	surface water temperature anomalies from 1880 to 1979 (GISTEMP Team 2019; Lenssen et al. 2019).
192	On average, the carrying capacity was a temperature-independent constant $K(x, y) = 8.25$ per
193	subpatch so each patch could carry a total of 66 individuals at carrying capacity. In our simulations, we
194	focus on two theoretical arrangements of high- and low-quality areas to represent different types of
195	fragmentation: one with few wide gaps in habitat quality and one with several narrow (Fig. 1e). In each,
196	the outer edges ($x \le 64$ and $x \ge 465$) are at a constant intermediate carrying capacity $K(x, y) = 8.25$,
197	while the center ($65 \le x < 464$) varies sinusoidally such that

$$K(x, y) = \frac{1}{4} + 8\left(1 + \sin\left(\frac{(x - 64)\pi}{G}\right)\right).$$
 (6)

198 In environments with few wide gaps, G = 50, such that there are four full sine waves in the central 199 region (spanning roughly 18.5°C of temperature change over space). In environments with several 200 narrow gaps, G = 12.5, with 16 full sine waves in the central region.

201 In each set of simulations, we first generated the environment by randomly selecting the 202 standard deviation of local heterogeneity H and environmental stochasticity S (Table 1). Next, we 203 generated 64 species, selecting unique random values for each species' thermal optima ζ_i , thermal 204 tolerance breadth σ_i , and dispersal distance γ_i . We numerically derived the reproductive strength ρ_i , 205 such that each species had the same overall reproductive potential B = 10 when integrating over 206 temperature, emulating a jack-of-all-trades-master-of-none trade-off (Levins 1968). To generate the 207 initial distribution and population size for all species in the community, we placed 4 individuals from all 208 species in all subpatches and ran the model for 500 time steps with no change in average yearly 209 temperature ($\tau = 0^{\circ}$ C/year). At the end of this initialization phase, we used the final population sizes for 210 each species in all subpatches as the initial conditions for climate change simulations.

211 Next, we simulated climate change on these initialized communities by adjusting the average yearly temperature change to $\tau = 0.04$ °C/year, roughly based on a "business-as-usual" projected 212 scenario (Urban et al. 2012, IPCC 2021). This scenario provides the greatest number of extinctions with 213 214 which to compare the relative efficacy of the different management strategies, where we expect that 215 relative efficacy (the focus of our analysis) to remain consistent across different climate scenarios. For 216 each community, we simulated the model for both 30 or 100 time steps after applying one of several 217 management scenarios and degrees of management effort. In particular, starting at the beginning of the 218 climate change (shift from $\tau = 0^{\circ}$ C/year to $\tau = 0.04^{\circ}$ C/year), we simulated "restore all", "corridor 219 establishment", "stepping-stone", and "reinforce" management strategies with total area restored values between $E = \frac{1}{2}LW$ and E = 8LW (with 16 total variations; Table 1). Similarly, we simulated two 220

threshold values for assisted migration ($\eta = 50$ or $\eta = 75$ individuals) with a maximum number of

222 relocations between F = 1 and F = 64 (with 16 total variations; Table 1). For comparison, we also 223 simulated community dynamics with no management effort (E = 0 and F = 0). 224 To evaluate how spatio-temporal heterogeneity affected management outcomes, we compared 225 the number of extinctions prevented for corridor establishment and assisted migration ($\eta = 75$) under 226 different levels of environmental stochasticity and local heterogeneity. To use comparable scenarios 227 between these strategies, we chose values for E and F such that both strategies had a similar number of 228 extinctions on average (E = 4WL for corridors and F = 8 for assisted migration). To evaluate which 229 species benefited under the different management strategies, we found the extinction probability for 230 each management action for species in each community that faced a variety of climate limitations: the 231 species with the shortest average dispersal distance, the species with the narrowest thermal tolerance, 232 the species with strongest competition in the poleward and equatorward direction (smallest difference 233 in ζ_i values), and a random species for comparison.

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235 Results

Habitat corridors, stepping-stone reserves, and restoring all locations reduced the number of species that went extinct during climate change, and each of these strategies reduced extinctions further when restoring a larger total area (Fig. 2a,c). However, the reinforcing strategy had a negligible effect on extinctions. Both corridors and stepping-stones benefitted with relatively little area restored with diminishing returns with higher area restored, while restoring all locations reduced extinctions nearly linearly with increased area restored. On average, corridors reduced the number of extinctions more than all other restoration-based strategies with equivalent area restored. Stepping-stones reduced

extinctions similarly to equivalent corridors with little area restored, but corridors were more effectivethan stepping-stones with higher area restored, especially in environments with fewer, larger gaps.

Assisted migration reduced extinctions on average, even with very few relocation events (Fig. 2b,d). However, increasing the maximum number of relocations above 16-24 did not reduce the average number of extinctions further. At this point, assisted migration prevented more extinctions on average than corridors at the highest area restored value we simulated. Both population thresholds for assisted migration that we simulated ($\eta = 50$ and $\eta = 75$) had similar extinction rates with equivalent relocation maximums.

251 Corridors were most effective at preventing extinctions in environments with low environmental 252 stochasticity and moderate local heterogeneity (Fig. 3a, c), while assisted migration was most effective in 253 environments with high heterogeneity and moderate stochasticity (Fig. 3b,d). Neither management 254 strategy was effective at reducing the number of extinctions in environments with low heterogeneity 255 and high stochasticity.

256 Randomly chosen species in simulated communities had a lower extinction probability under 257 both corridor and assisted migration strategies, but the shortest dispersing species in a community 258 disproportionately benefited more than random species (Fig. 4). Without management action, the 259 shortest dispersing species had greater than 50% of going extinct throughout all variations of our simulations. Both management strategies reduced these extinction probabilities by more than 14% at 260 261 similar effort levels (E = 4WL and F = 8). Reduction in extinction probability was greater for shortest 262 dispersers than for random species in all scenarios. Other species likely to face extinction during climate 263 change (narrowest thermal tolerance and the smallest difference in thermal optima with neighboring 264 species on either pole- or equator-ward edges) were also less likely to face extinction with either 265 management strategy, but only assisted migration reduced the extinction of these species

266	disproportionately more than random species. Distinguishing the efficacy of assisted migration and
267	corridors for different species and environmental conditions required longer-run (100 time step)
268	simulations, as shorter-run (30-time step) simulations did not have enough extinctions to determine the
269	impact of management interventions on extinction likelihood (2.0%-3.5% of species going extinct in 30
270	time steps versus 18.4%-31.6% of species going extinct in 100 time steps; Figs. S1-S2).
271	
272	Discussion
273	Most of the simulated management strategies reduced extinction probability under climate
274	change in our simulated communities, and they reduced extinction rapidly with an initial investment in
275	conservation effort. Without climate change, corridors, even when low quality, can facilitate species'
276	movement and long-term persistence in a metacommunity (Haddad & Tewksbury 2005; Williams et al.
277	2005). Adding to this, our model suggests that even relatively low-quality corridors between higher-
278	quality areas could reduce extinction during climate change. Because restoring connectivity also
279	increases total habitat area, the effects of increased connectivity and increased area are often
280	confounded (Hodgson et al. 2009). Though many previous studies suggest that habitat reinforcement is
281	often better at protecting species than connectivity restoration (Harrison & Bruna; Fahrig 2001; Falcy &
282	Estades 2007), our results suggest that corridors are likely to be better at increasing the persistence of
283	range shifting species in the presence of climate change than other methods of connectivity and
284	protection that restore the same amount of area.
285	Similar to corridors, assisted migration reduced extinctions on average, even with relatively few
286	relocation events in our model. Because many species in the simulated communities face little
287	extinction risk from climate change, focusing relocation on a small number of vulnerable species was
288	able to have a disproportionate effect on community-wide extinctions. If only a small number of species

289	are at risk or conservation benefits can be realized by focusing on few species (Simberloff 1998; Enquist
290	et al. 2020), but the few species at risk of extinction could require a high investment in management
291	effort on their own. In practice, many conservation translocations are unsuccessful (Fischer &
292	Lindenmayer 2000; Bubac et al. 2019), so managers might need to relocate a single species several times
293	to increase the overall chance of establishment in the recipient location (Backus and Baskett 2021). Even
294	after successfully establishing a new population, species with weak dispersal ability might continue to
295	lag behind shifting climates and face extinction later. As climate change continues, these conservation-
296	reliant species (sensu Scott et al. 2005) may depend on repeated direct management actions without
297	increased connectivity (Lawler & Olden 2011).
298	Because we found relatively few extinctions in our nearer term simulations (30 time steps; Figs.
299	S1-S2), the difference in the efficacy of management approaches was negligible, and we required long-
300	run simulations (100 time step) to show the efficacy of corridors and assisted migration. This potential
301	time lag to observable impact presents a challenge for monitoring to verify anticipated outcomes or
302	adjusting management as needed in an adaptive management approach (Rist et al 2013). However,
303	nearer-term impacts of management action might be evident in cases where optimal climates have
304	already shifted away from species' historical ranges, as has occurred for many species (Chen et al. 2011;
305	Poloczanska et al. 2013), and our results suggest that near-term biodiversity conservation management
306	can have long-term benefits for species persistence.
307	

307

308 Types of species benefitting from each management strategy

Adding to the extinction risks caused by fragmentation, many species are at risk of extinction from climate change because of a variety of biological limitations (Pearson 2006; Gilman et al. 2011; Urban et al. 2012; Urban 2015). We found that both corridors and assisted migration were effective at 312 reducing the extinction of species with short dispersal in our model. These species benefited from 313 increased connectivity regardless of the size of low-quality gaps. A previous simulation study showed 314 that longer-dispersing competitors were likely to block shorter-dispersing species from tracking climate 315 change in competitive communities with variable dispersal ability (Urban et al. 2012). Without 316 connectivity, short-dispersing species that might disperse over patchy landscapes, but low population 317 sizes, low propagule pressure, and strong competition means that these new populations are unlikely to 318 establish (Lockwood et al. 2005; Plein et al. 2016). For corals, the species that are likely to have shorter 319 average dispersal range, and likely to benefit from either corridor-like connectivity or assisted migration. 320 are brooding species that release larvae directly from polyps rather than those that broadcast gametes 321 into the water column (Ayre & Hughes 2000). Dispersal distance of trees is generally thought to be a 322 function of seed size, tree height, and mode of dispersal (Bullock et al. 2016), where shorter trees that 323 disperse seeds by wind or ballistics are more likely to have shorter dispersal than taller trees that 324 dispersed seeds by birds.

325 In comparison, species narrow thermal tolerance and strong competition benefited more from 326 assisted migration than restoration-based approaches. In corals, based on a trait-dependent clustering 327 analysis of life history strategies, those with narrow thermal tolerance (i.e., outside of the "generalist" 328 and "stress-tolerant" categories) and likely to experience strong competition (i.e., outside of the 329 "competitive" category) fall into a category of "weedy" life histories, which are associated with small 330 colony sizes and reproduction via brooding (where brooding increases reproductive success at low 331 population sizes compared to mass spawning; Darling et al. 2012). Tree species with narrow geographic 332 ranges may have narrow climate tolerance (though see Early & Sax 2014), whereas early successional 333 species may face higher competition (Grime 1987).

Note that restoration and assisted migration are not dichotomous and can be integrated
 together in a larger management plan (Lawler & Olden 2011). Most tree species have low dispersal

relative to climate change (Corlett & Westcott 2013), and most corals have narrow climate tolerance
relative to climate change (Hughes et al. 2017), so these species could be threatened by climate change
for multiple reasons. In these cases, increasing connectivity would benefit most species in the
community and assisted migration would benefit those that disproportionately lag behind climate
change.

341

342 Environmental characteristics for different management strategies

343 In our simulations, the optimal management strategy depended on the characteristics of the 344 environment. For example, species in environments with low stochasticity might especially benefit from 345 corridor establishment over assisted migration. Because corridors are relatively small or low quality 346 compared to the higher quality areas they connect, the population sizes in those corridors would be 347 relatively small and susceptible to extinction (Lande 1993). Lower environmental stochasticity could 348 allow a species to track climate change gradually, alongside several species competing to keep pace with 349 climate change and move through the same limited area of a corridor. In coral reefs, one might identify 350 regions of lower stochasticity through maps of past and projected degree heating weeks, a cumulative 351 stress metric that predicts coral bleaching, which can then serve to inform the designation of reserve 352 networks (Mumby et al 2011). In forests, one might preserve larger patches with smaller perimeter-to-353 area ratio, as edges between forest and fragments experience higher environmental stochasticity and 354 frequency of rare weather events (Laurance 2004; Laurance et al. 2011).

In contrast, we found assisted migration to be particularly effective at reducing extinction in environments with moderate-to-high stochasticity. Because small populations are more likely to face extinction in environments with high environmental stochasticity (Lande 1993), both donor and recipient populations could face high extinction probability during assisted migration in stochastic 359 environments. However, the benefits of moving a species near its optimal climate likely outweigh the 360 risks of establishment failure on average, especially when planning multiple relocation events and 361 relocating a fraction of a single population each time (Backus & Baskett 2021). Therefore, assisted 362 migration might become an increasingly relevant management tool with increasing environmental 363 variation and extreme events with climate change, such as marine heat waves in coral reefs (Fordyce et 364 al 2019) and extreme droughts or fires affecting forests (Keeley & Syphard 2016; Williams et al. 2019). In 365 our model, assisted migration was also more effective at reducing extinction in environments with 366 higher local heterogeneity. Heterogeneous environments can act as climate refugia (Dobrowski 2011, Morelli et al. 2016), reducing the velocity of climate change or the negative effects of interannual 367 368 variation. Because a highly heterogeneous recipient location is more likely to have a suitable 369 microclimate for the relocated population to establish, relocating a population into a refugia-like 370 environments could limit the risk of moving the population into the wrong place at the wrong time. For 371 coral reefs, such local-scale heterogeneity and refugia might arise from fore-reef/back-reef structure, 372 depth gradients, and physical structures that drive variability in local upwelling or tidal currents (Smith 373 et al 2017). For forests, high local-scale heterogeneity is often found in areas with steep elevational 374 gradients with similarly steep climate gradients (Morelli et al. 2016).

375

376 *Model assumptions*

Even though a small amount of restoration or few relocations had large conservation benefits in our simulations, the actual economic and logistical costs of these strategies can be expensive. The total area restored metric does not fully reflect the economic costs of these approaches. To simplify comparison, we assumed that one unit of area restored (increasing the carrying capacity of the community by one individual) is equivalent for all species, regardless of how that area restored is 382 distributed around the simulated environment. Realistically, conservation efforts and cost would vary 383 across species and location (Naidoo et al. 2006; Magris et al. 2015). A corridor that spreads conservation 384 spending across a wider range of low-quality areas would not be equivalent to a stepping-stone 385 approach that uses the same spending in a smaller, condensed region. Also, considering inherent 386 variation in land and water value or quality (Newburn et al. 2005), it would be difficult to improve the 387 habitat quality of some locations, such as urban coastal waters, beyond a certain point. If the cost of 388 protecting unbroken habitat corridors is prohibitive, "land sharing" approaches that allow conservation 389 and human use to co-occur could enable connectivity (Green et al. 2005; Fischer et al. 2014). 390 Our model also simplifies some important ecological and evolutionary dynamics that might 391 complicate comparisons between restoration and assisted migration-based approaches. In particular, 392 our simple competition-based model does not include trophic interactions or disease dynamics. 393 Incorporating these interactions could allow for relocated species to become invasive or spread disease, 394 both of which are potential risks of assisted migration (Ricciardi & Simberloff 2009; Hewitt et al. 2011). 395 We also ignore evolutionary dynamics in this model. Evolutionary dynamics could increase the 396 effectiveness of connectivity-based approaches, as natural dispersal would favor increased gene flow of 397 climate-tolerant genes as species naturally track climate change through corridors (Sgrò et al. 2011). 398 Lastly, we compared the extinction probability of species in our model, but other conservation 399 goals might include maintaining ecosystem function or maintaining biomass for harvesting, among other 400 goals. These alternative goals could favor different management strategies, as the benefits of each 401 strategy are weighed by stakeholders depending on their willingness to engage in assisted migration 402 with its high perceived risk or restoration-based approaches which could involve stakeholders giving up 403 their land or harvesting rights. Further analysis of alternative management strategies to buffer against 404 extinction from climate change and other conservation goals would benefit from a structure-decision

- 405 making approach that considers the full array of risks, benefits, and uncertainties related to the array of
- 406 potential stakeholder goals.

407

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- 412

413 Data accessibility

- Simulation code, simulation results, and code to reproduce the plots in this paper are available at
- 415 <u>https://github.com/gabackus/comparingManagementStrategies</u>.
- 416
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419

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599 Tables

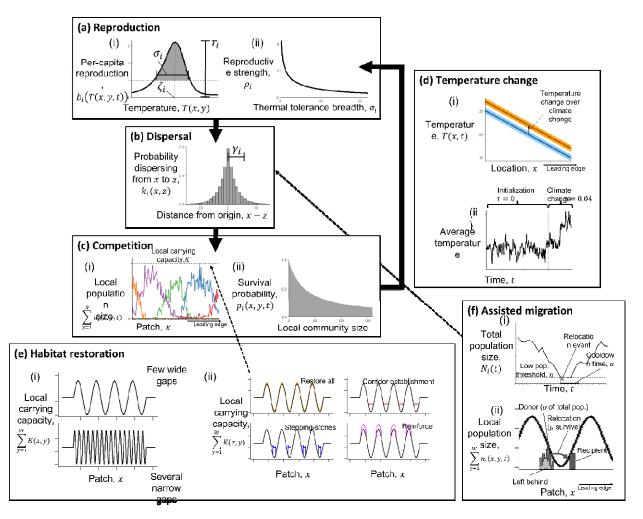
Table 1: Definitions of the symbols used in the model.

Parameter	Symbol	Values	Units
Total species in pre-initialized community	Ω	64	species
Dispersal distance of species <i>i</i>	γi	Lognormal; mean=2.5, st. dev.=2.5	patches
Thermal optimum of species <i>i</i>	ζ_i	Uniform; 9.78 to 30.22	°C
Thermal tolerance breadth of species <i>i</i>	σ_{i}	Lognormal; mean=5, st. dev.=5	°C
Reproductive strength of species <i>i</i>	$ ho_i$	Derived from σ_i	-
Skewness constant	λ	-2.7	-
Fraction of population relocated	ϕ	0.55	-
Assisted migration survival probability	μ	0.8	-
Low population threshold	η	50 or 75	individuals
Cooldown time between relocations	α	5	years
Total patches	L	512	patches
Subpatches per patch	W	8	
Subpatch carrying capacity	K(x, y)	Varies with space (average 8.25)	Individuals
St. dev. in local temperature heterogeneity	Н	Uniform; 0 to 2	
St. dev. in interannual temporal stochasticity	S	Uniform; 0 to 1	
Mean annual temperature change	τ	0.04	°C/year
Annual temporal autocorrelation	κ	0.767	-
Annual temporal standard deviation	ψ	low=0.1639, high=0.6556	°C
Total area restored	Ε	$\frac{1}{8}LW$ to LW (by $\frac{1}{8}LW$), LW to	individuals
		8 <i>LW</i> (by <i>LW</i>)	
Maximum relocations allowed	F	1 to 8 (by 1), 8 to 64 (by 8)	relocations

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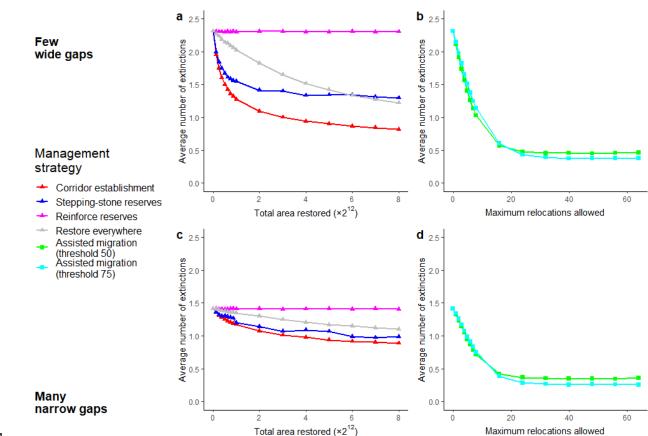
602 Figures



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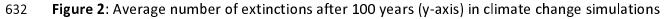
604 **Figure 1**: Figure 1: During each time step of the model, all extant species cycle through (a) reproduction, (b) dispersal, and (c) competition before (d) the temperature changes and the 605 next time step continues. (a.i) Per capita reproductive output 606 is skew-normal. 607 dependent on temperature This function is shaped by species' thermal optimum 608 and thermal tolerance breadth . (a.ii) Reproductive strength scales the total reproductive 609 output so that species with narrow (specialists) have higher reproduction and species with 610 (generalists) have lower reproduction. (b) The dispersal kernel is a long-tailed "double broad geometric" distribution with a mean dispersal distance . (c.i) All species compete over limited 611 space, where each patch has a carrying capacity . Here each line represents a different 612 species. (c.ii) In each patch, individual survival probability decreases as the total 613 community size increases. (d) Temperature changes stochastically over time. (d.i) Mean 614 temperature decreases linearly with space. Over time, between 615 (lower line) and 616 (upper line), the temperature increases. (d.ii) Temperature variation over time depends on level of environmental stochasticity. The vertical dashed line designates when the model changes 617 from the initialization phase (average temperature change ()) to the climate change and 618 619 intervention phase (). Climate change only occurs after a relatively stable

- 620 metacommunity has been assembled, after 100 time steps have passed with no extinctions.
- 621 (e.i) Two types of fragmented environments compared: one with few large gaps and one with
- 622 several narrow gap. (e.ii) Each of the four restoration management strategies (colored lines).
- Each involved increasing the integral of carrying capacity over space by an amount *E* more than
- the original carrying capacity (black lines). (f.i) Relocation occurs once the total population of a
- species falls below a threshold η . To avoid repetition while the species recovers, no relocations
- occur during a cool-down period following relocation α . (f.ii) A fraction ρ of the population is
- 627 removed from its original distribution and moved to the closest new location where the
- average temperature $\overline{T}(x, t) \le \zeta_i + 0.2$ and the carrying capacity K(x, y) > 5 (only a fraction
- 629 μ survive). Remaining individuals disperse naturally.

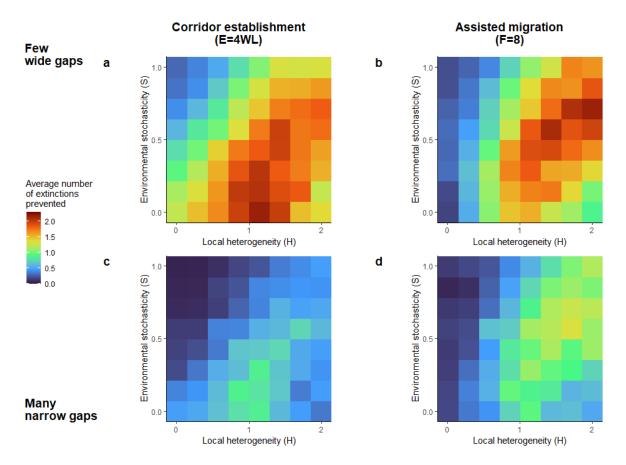


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- 633 depending on management strategy (color/shape), amount of area restored for restoration-
- based modification (a,c) or maximum number of relocations allowed for assisted migration (b,d;
- 635 x-axis), and environment structure (a-b: few wide gaps, c-d: many narrow gaps). Each point is
- 636 the mean of 10000 simulations.



637

Figure 3: Average number of species prevented from extinction over 100 years (color) in 638 climate change simulations as it depends on local heterogeneity H (standard deviation of 639 temperatures per patch, x-axis) and environmental stochasticity S (standard deviation of 640 interannual variation in temperature, y-axis). Each box represents the mean of between 135 641 and 189 simulations within an 8x8 quantiles of the range of all simulations. Panels (a) and (c) 642 represent simulations with corridor establishment and panels (b) and (d) represent simulations 643 with assisted migration. The total area restored in corridor establishment (E = 4WL) and the 644 645 maximum number of relocations in assisted migration (F = 8) represent two cases where these 646 two strategies prevent a similar number of extinctions on average for the "few wide gaps" environment, but not when comparing across equivalent levels of H and S. (a,b) represent 647 simulations of environments with few wide gaps and (c,d) represent simulations of 648 environments with several narrow gaps. 649

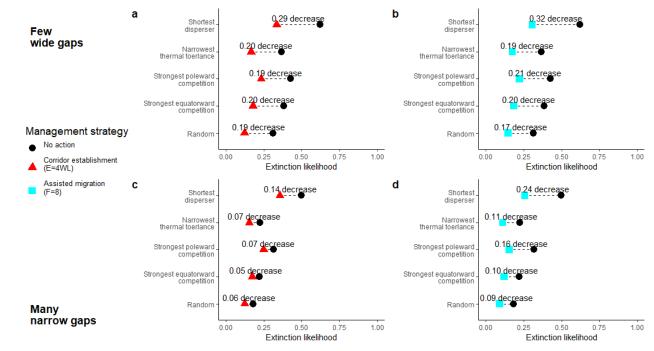




Figure 4: Likelihood that a species went extinct in 100 years (x-axis) in our climate change

simulations depending on management strategy (color/shape, with corridors in panels a,c and

assisted migration in panels b,d), which particular species it was in the community (y-axis) and

environment type (a-b: few wide gaps, c-d: many narrow gaps). The particular species here are

the species within the internal region of the environment ($65 \le x < 464$) with the shortest

dispersal distance γ_i , the species with the narrowest thermal tolerance σ_i , the species in the

657 community with extant neighboring species community closest to that species thermal

optimum ζ_i , and a randomly chosen species. Each point is the mean of 10000 simulations.