

Systematic Nature Positive Markets

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26

Abstract

Environmental markets are a rapidly emerging tool to mobilize private funding to support landholders to undertake more sustainable land management. One aim of such markets is to incentivize ecosystem restoration world-wide. How we measure and subsequently trade units of biodiversity within these markets creates key challenges both ecologically and economically, since it determines whether environmental markets will be ecologically successful in delivering net gains in biodiversity, and economically efficient in lowering the costs of conservation. Our innovation in this paper is to develop and then test a new metric for such markets based on the well-established principle of irreplaceability from Systematic Conservation Planning. Irreplaceability as a metric allows us to capture the multidimensional nature of ecosystems (e.g., habitats, species, ecosystem functioning) yet simultaneously achieve cost-effective, land manager-led investments in conservation. Using an integrated ecological modelling approach, we tested whether using irreplaceability as a metric is more ecologically and economically beneficial than the simpler biodiversity offset metrics typically used in net gain and no-net-loss policies. Taken together, our results demonstrate that irreplaceability can deliver no net loss of biodiversity, avoids the limitations of like-for-like trading, reduces costs of offsetting to developers and society, ensures land managers are fairly rewarded for the opportunity costs of conservation, and safeguards sites critical to achieving conservation goals. More generally, our study highlights the benefits of integrating economic data and approaches within Systematic Conservation planning as a means of incentivizing the most ecologically and economically efficient investments in nature recovery.

Keywords: irreplaceability, prioritization, offset market, biodiversity net gain

Article Impact Statement: Trading credits based on irreplaceability efficiently guides Nature positive investment across the complexity of ecosystems.

27 **Introduction**

28 More than 75% of the Earth's land is degraded, and this has led to widespread biodiversity loss,
29 undermining the well-being of billions of people, as well as our efforts to combat climate change
30 (IPBES 2019). Current evidence suggests multiple planetary boundaries have been exceeded
31 (Steffen et al. 2015) and business-as-usual is highly likely to result in catastrophic collapse across
32 many ecosystems (Armstrong McKay et al. 2022). Yet numerous global commitments to reduce,
33 stop or even reverse current rates of biodiversity loss have not been met (Tittensor et al. 2014;
34 Díaz et al. 2019). Instead, reversing global terrestrial biodiversity trends will only be achievable if
35 we adopt strategic, coordinated, and above all ambitious, action (Leclère et al. 2020). To “bend
36 the curve” toward a more nature-positive future, private sector funding of biodiversity
37 conservation needs to be increased to complement longer-established publicly funded programs.
38 The ENACT initiative (Enhancing Nature-based Solutions for an Accelerated Climate
39 Transformation) launched at COP27 calls for the mobilization of private finance to support action
40 on nature and climate-related targets the world over, accompanied by robust environmental and
41 social safeguards (IUCN 2022).

42 Environmental markets are one such tool to mobilize private finance which can incentivize
43 landholders to undertake more sustainable land management actions (Schmalensee & Stavins
44 2017). Such markets create income streams in the form of tradeable credits for landholders in
45 return for undertaking actions to protect and/or enhance specified environmental goods and
46 services, for example biodiversity, carbon sequestration or water quality. Demand (and thus
47 buyer willingness to pay) for these credits can be voluntary, arising from a demand from
48 individuals or companies who wish to offset their negative environmental impacts; or else are
49 created through government regulation, for example through requiring developers to purchase
50 credits to offset new house building (Needham et al. 2019; Radu et al. 2020).

51 In this paper, we focus on regulated markets for biodiversity offsets where developers must
52 purchase credits to mitigate impacts on biodiversity as a result of development activities such as
53 mine construction, housing, road building or hydroelectric dams. Credits are supplied by

54 landowners who switch their current land management (such as arable farming) to a more
55 conservation-orientated alternative (such as wetland creation). In regulated offset markets, state-
56 sanctioned intermediary bodies such as offset banks validate credits and enforce offset
57 requirements placed on developers. By establishing an appropriate rate of exchange between
58 sellers (landowners) and buyers (developers), biodiversity offset markets can, in principle,
59 achieve no net loss of biodiversity or a net gain within some defined area at the lowest overall
60 economic cost to society, and are thus potentially economically efficient (Needham et al, 2019).

61 Within both regulated and voluntary nature markets, the choice of biodiversity metric plays a
62 pivotal role in determining their ecological and economic performance (Simpson et al. 2021). This
63 metric establishes the units in which biodiversity is traded, determining how a regulator or offset
64 bank measures the gains in biodiversity resulting from restoration actions undertaken by
65 landowners, and balances those against the expected biodiversity lost due to development
66 impacts. Simple metrics based on a combination of the area and condition of habitat are often
67 preferred by regulators (Bull et al. 2014; zu Ermgassen et al. 2019), easing the task of identifying
68 matching biodiversity units, and assuming that habitat classes indirectly capture benefits on other
69 aspects of the ecosystem (Marshall et al. 2020). However, numerous studies have demonstrated
70 that these approaches rarely benefit biodiversity in the manner intended, or else fail to deliver
71 gains in biodiversity in an economically efficient manner (Maron et al. 2012; Bull et al. 2014; zu
72 Ermgassen et al. 2021).

73 In this study, we develop and then apply a new metric for application in biodiversity offset
74 markets, and in environmental markets more broadly, that derives from the Systematic
75 Conservation Planning (SCP) literature (Margules & Pressey 2000; McIntosh et al. 2017). SCP
76 tools are designed to minimize the cost of achieving conservation targets. The importance of any
77 specific site to achieving conservation targets is measured by its *irreplaceability*. A site that is
78 essential to achieving targets is completely irreplaceable (and its loss could not be offset),
79 whereas irreplaceability is low for sites which can be easily substituted for many others to

80 contribute to conservation targets. Crucially, irreplaceability can aggregate the importance of a
81 specific site over multiple biodiversity features, integrating the likelihood that actions are
82 successful across space with ensuring that overarching targets for the whole landscape are
83 achieved. This integration represents a step change away from like-for-like compensation
84 regimes in existing biodiversity offset markets (for example BBOP 2009; Natural England 2022;
85 NSW DPE 2022). Furthermore, if conservation targets are chosen to exceed their existing
86 availability in a landscape, this embeds net-gain as an implicit outcome where this is needed to
87 meet specific targets.

88 Our contribution is to demonstrate that an offset market steered by a metric derived from
89 irreplaceability ensures the opportunity to achieve conservation targets is always protected, and
90 results in the network of conserved sites selected being more economically efficient than that
91 obtained using simpler offset metrics. Irreplaceability as a metric thus offers a step-change in the
92 design of biodiversity offset and environmental markets, which is important given the current fast
93 rate of expansion in such nature markets globally.

94 **Materials and Methods**

95 **Irreplaceability recast for biodiversity offset markets**

96 Systematic Conservation Planning is a rigorous, repeatable, and structured approach to
97 designing protected areas that efficiently meet conservation objectives (Margules & Pressey
98 2000). At an analytical level, the task is a classic resource allocation problem that either
99 maximizes conservation outcomes within a given resource budget, or else minimizes the cost of
100 achieving specified conservation targets (Moilanen et al. 2009). This structure has led to the use
101 of SCP in supporting conservation decisions across the globe (McIntosh et al. 2017). A key
102 strength of SCP is that it can incorporate a wide variety of data types, including attributes of
103 ecosystems at all levels of structural, taxonomic, and functional organization, as well as
104 accounting for social, financial and political constraints and opportunities (Knight et al. 2011; Ban
105 et al. 2013). Suitable targets are often based on the principle of adequacy, which aims to maintain

106 the viability and persistence of those features (Kukkala & Moilanen 2013). Species-level targets
107 may be informed by population viability analyses, or habitat-level targets by species-area
108 relationships, and functional targets may be informed by our need for particular services across
109 landscapes (Bryan et al. 2010). The value of any specific site is based on its *marginal* contribution
110 to achieving the conservation targets by complementing what features are already secured. A key
111 feature therefore of SCP is that, unlike ranking procedures, properties of reserve systems emerge
112 from the combination of areas either through the complementarity of their composition, or by their
113 connectivity in space. This suggests a strong potential advantage for using a metric derived from
114 SCP within biodiversity offset markets, where a need exists to be able to compare ecological
115 gains and losses across space between development sites (where biodiversity declines) and
116 offset supply sites (where biodiversity is increased due to the action of the landowner). Moreover,
117 a biodiversity offset metric needs to make sense in the context of an overall policy target of no net
118 loss or net gain in a specific aggregate indicator of biodiversity. This combination of an aggregate
119 target with the need to compare gains and losses across space suggests that a metric derived
120 from SCP could have important advantages over the kinds of metrics investigated so far in the
121 offset markets literature (Simpson et al. 2022).

122 Provided with data on feature values for all planning units, planning unit costs, and the desired
123 targets for protection, systematic conservation planning tools identify which sets of sites deliver
124 conservation targets most efficiently (Moilanen et al. 2009). For convenience, we refer to
125 “features” and “planning units” as *species* and *sites* hereafter. Often targets can be achieved by
126 many different combinations of sites because alternatives exist with similar, or at least
127 complementary, values. The importance of any specific site to achieving conservation targets is
128 measured by its *irreplaceability*. A site that is essential to achieving targets is irreplaceable (and
129 its loss could not be offset), whereas irreplaceability is low for sites which can be substituted by
130 many others. An exact calculation of irreplaceability rapidly becomes intractable as the number of
131 combinations to test grows exponentially with the number of planning units (Pressey et al. 1993),
132 and alternatives to estimate irreplaceability have been proposed (Ferrier et al. 2000). Most

133 recently, Baisero et al. (2021) proposed a new metric for describing irreplaceability (α) that
 134 defines the extent to which a site k is essential for achieving the conservation of species s as:

$$135 \quad \alpha_{k,s} = \begin{cases} 0 & \text{if } t_s = 0 \\ 0 & \text{if } t_s \geq R'_s \text{ and } R_{k,s} = 0 \\ 1 & \text{if } t_s \geq R'_s \text{ and } R_{k,s} > 0 \\ \min\left(\frac{R_{k,s}}{R'_s - t_s}\right) & \text{otherwise} \end{cases} \quad (1)$$

136 where the difference between the total availability of a species in the landscape R'_s and its target
 137 t_s indicates how much of that availability a site can contain ($R_{k,s}$) before it becomes irreplaceable.
 138 Baisero et al. (2021) defined β as the combined irreplaceability of a site by taking the complement
 139 of the product of replacement probabilities $\beta = 1 - \prod(1 - \alpha_{k,s})$. However, this constrains site
 140 irreplaceability to between 0 and 1, and consequently no longer indicates whether a site was
 141 irreplaceable for one or many species. To retain this distinction and make comparisons among
 142 sites within an offset market equivalent, we use summed α -irreplaceability. We note Ferrier et al.
 143 (2000) also summed irreplaceability in their study for a similar reason (albeit with a different
 144 formulation for each species), and therefore from now on our paper specifically refers to the sum
 145 of α -irreplaceability ($\sum \alpha_{k,s}$), which we abbreviate here to $\sum \alpha$.

146 **The biodiversity offset market**

147 The structure of the biodiversity offset market was based on the model developed by Simpson et
 148 al. (2021). A single agent controls each land parcel or site within a landscape. Each agent
 149 decides to either develop their land for housing, generate biodiversity offset credits by adopting a
 150 conservation land management practice, or remains in the current land use of agriculture. For an
 151 agent to develop their land, each hectare acquired for new housing development requires a
 152 number of offset credits to be purchased from an offset provider equal to the measured
 153 biodiversity value of the site. The developer's maximum willingness to pay (WTP) for an offset
 154 credit is determined by the expected value of land for housing development and the need to
 155 purchase offset credits. Ranking this WTP from highest to lowest yields a downward-sloping
 156 demand curve for offset credits. This WTP varies over space due to variations in house prices

157 and the value of each site for biodiversity. We assume the offset credits are supplied by agents
158 on agricultural land (“farmers”). Farmers change their current agricultural land management
159 practices in a way which increases the biodiversity by a measured amount at the site. Every
160 hectare given up to benefit biodiversity means one less hectare for agricultural production.
161 Furthermore, the farmer may incur restoration costs in creating an offset credit. Therefore, the
162 conversion cost to the farmer consists of the opportunity costs of the foregone agricultural output
163 plus any associated restoration costs. This sum is the farmer’s minimum price they will sell an
164 offset credit for, known as their minimum Willingness to Accept (WTA). Since agricultural
165 productivity and profits vary across space (due, for example, to variations in soil quality or site
166 altitude), the minimum WTA of farmers to create biodiversity credits will also vary over space.
167 Ranking farmers from lowest WTA to highest WTA generate a supply curve for offsets. Farmers
168 and developers interact in this market to generate an equilibrium, market-clearing price for offsets
169 where marginal WTP and marginal WTA are equal, that is, where supply for credits equals the
170 demand for credits.

171 **Simulation**

172 *Inputs:* To demonstrate the operation of a biodiversity offset market using the $\sum\alpha$ -irreplaceability
173 metric we simulated the probability of species occurrence within a 64 x 64 patch (or site)
174 landscape. We used the R packages *NLMR* and *landscapetools* to control the degree of spatial
175 autocorrelation in the baseline environmental gradient (Sciaini et al. 2018). Note however that α -
176 irreplaceability is determined by the global availability of that species, not their distribution, and
177 that the simulation of maps was solely intended to communicate the parallels with field-data and
178 empirical models. We subsequently simulated three communities, each with 200 species whose
179 distributions were either equally distributed across the environmental gradient, or moderately and
180 highly skewed towards one extreme to produce an overall gradient in richness (Leroy et al. 2016).
181 We ran offset market simulations based on subsets of species from each community, rising from
182 5 to 50 species and repeated 10 times each. More complex arrangements in response to multiple

183 gradients are easily generated, but not considered further here. Likewise, we did not account for
184 time lags or uncertainties in the ability of conservation actions to generate offset credits.

185 Four further pieces of information were generated for each site. The values of each patch of land
186 for agriculture and for housing development were generated by defining their correlation to the
187 environmental gradient (ranging from 0-1), although without a clear rationale for how these costs
188 are expected to co-vary, both correlation coefficients were set to zero in our simulations. To
189 reduce the likelihood that market trading stalls when $WTA < WTP$ (and where therefore potential
190 gains from trade still exist), the mean development value was set to double that of agricultural
191 value. Next, each site is assigned to one of three initial land use classes: agriculture,
192 conservation, and development in a 70:20:10 split. Lastly, a “habitat” layer is generated to
193 indicate where habitat, and hence species, currently occur on agricultural land and in conserved
194 sites to define the baseline from which “gains” should be compared. Agricultural land patches
195 without habitat, but with suitable environmental conditions for species to occur, are treated as
196 areas with restoration potential. The final inputs are the conservation targets for each species. To
197 illustrate a scenario of net-gain, rather than no-net-loss, we set targets in all scenarios to be the
198 equivalent of each species existing availability plus 20% of their restoration potential at
199 agricultural sites.

200 *Market:* After each offset trade the $\sum\alpha$ -irreplaceability is recalculated for all sites. An agricultural
201 site that is not irreplaceable for any species (all individual $\alpha < 1$) and has the greatest WTP per unit
202 loss in the metric ($\text{£}/\sum\alpha$), is selected for development. If the development site $\sum\alpha$ is 0, either
203 because the site has no species potential at all, or because all species with potential have
204 already achieved their targets, then no offset is required. Otherwise, an offset site with the lowest
205 WTA per unit gain in the metric ($\text{£}/\sum\alpha$) is selected and either all or a fraction of species values at
206 that site are assigned to conservation status. The species values at the developed sites are
207 removed from the global total R'_s and the values added by the offset are deducted from the
208 remaining targets t_s . These steps are then repeated until all species conservation targets have

209 been achieved, or there are no mutually beneficial opportunities to trade in biodiversity credits
210 remaining (that is, a market equilibrium where for all remaining sites $WTP < WTA$).

211 *Performance:* To rate the performance of an offset market based on $\sum\alpha$ -irreplaceability we
212 compared the efficiency with which targets were achieved using alternative metrics for the same
213 landscape. Firstly, the R package *prioritizr* was used to identify the exact optimal combination of
214 sites that achieved all conservation objectives for minimal cost (Hanson et al. 2022). Secondly,
215 the offset market was re-run using three alternative site-based metrics that increasingly reduced
216 the need for the information involved in strategic planning. The first offset metric (OM1) weighted
217 site scores by the inverse of each species range, thereby favoring the rarest taxa in the
218 landscape (Crisp et al. 2001). OM1 scores were also continually updated to reflect changes in
219 global availability due to the market. OM1 assumes the same degree of knowledge as required
220 for the $\sum\alpha$ -irreplaceability, but without setting targets. Updates to planning unit scores reflect
221 species' global availability, but not complementarity to areas already protected. Offset metric 2
222 (OM2) is equivalent to OM1, but values for each planning unit are not updated over time meaning
223 weights for each species were fixed at their starting value. This metric required the same initial
224 understanding of species distributions but does not require an updating register of species
225 affected by previous offset transactions. Finally, offset metric 3 (OM3) was based solely on how
226 many species were present in each site, but not which species, meaning only a map of species
227 richness would be required to guide a market.

228 The code and a full description of the results reported in the paper are provided in the
229 supplementary material.

230 **Results**

231 **Irreplaceability achieves conservation targets in an economically efficient manner**

232 Our simulations demonstrated that using $\sum\alpha$ within an offset market resulted in continuous
233 incremental progression was made toward conservation targets (Fig. 1a). The potential economic

234 gains from trade were realized as long as developers WTP exceeded farmers WTA and this
235 trading allowed all species to achieve their conservation targets. Economic gains from trade are
236 initially high when trading first takes place ($WTP \gg WTA$; Fig. 1b, note the log scale) but rapidly
237 decline as more expensive and less irreplaceable offsets are required to meet demand. At each
238 stage the market favored the greatest gains towards targets at minimal cost, making more likely
239 an economically efficient solution to achieving the targets. Conversely, $\sum\alpha$ -irreplaceability strongly
240 dis-incentivized developments from taking place on land with high $\sum\alpha$ scores, because the
241 number of offset sites typically required to replace their loss is typically prohibitive (Fig. 1c).

242 $\sum\alpha$ -irreplaceability does not specifically prioritize sites that contain species rarely found in the
243 landscape; it values sites based on the difficulty of achieving conservation targets without them.
244 Nonetheless, as there are typically fewer opportunities to conserve rare species (i.e. low
245 replaceability), sites that contain those species tend to score highly. In our model, once a species
246 target was reached (green line Fig. 1d), their contribution to the $\sum\alpha$ of remaining agricultural was
247 zero, meaning there was no benefit to its presence within new offsets, or cost associated with its
248 occurrence at new development sites. Nonetheless, some species could eventually exceed their
249 targets because they were present at offset sites added later to achieve targets of other species
250 (Fig. 1a and d). As the $\sum\alpha$ contribution of species that have met their targets is zero, this reduces
251 the burden for developers and increases their WTP for offsets at sites that contain species whose
252 targets have been achieved (red line Fig. 1d).

253 **Accounting for more species in the market does not necessarily increase costs, or require**
254 **more offsets, or a greater conserved area to meet targets**

255 The distribution of biodiversity, in particular the degree to which multiple targets overlap with
256 others, determines the degree to which additional sites are required to protect additional species.
257 As illustrated by our simulations (Fig. 2), the network is specific to the assemblage, and how the
258 ecological community correlates spatially with economic land values. Our results showed that
259 accounting for conservation targets of more species did not in itself increase the cost of

260 conservation solutions, or require more trades, or more space to meet targets (Fig. 2b and 2c).
261 However, in all cases, the wide variation in outcomes for small subsets of taxa illustrated the risks
262 associated with conservation policies reliant on small numbers of indicator species whose
263 suitability to represent the conservation needs of biodiversity and ecosystem processes is
264 unknown (Yong et al. 2018).

265 **Irreplaceability-led offsetting is comparable to optimal prioritization**

266 Our modelling framework allowed us to compare site prioritization generated by SCP optimization
267 with site selection through the $\sum\alpha$ -led offset market (Fig. 3). Site prioritizations generated by SCP
268 were mathematically optimal, minimizing the cost of land needed to achieve all conservation
269 targets. But rather than being reliant on landowners WTA, the SCP solutions assumed that
270 regulators or planners have full control over site selection and management. This is rarely the
271 case where much land is privately owned. Consequently, our results showed that if we assume
272 developer's WTP is sufficient to support continued trading, the $\sum\alpha$ offset market could achieve all
273 targets using very different networks of sites than the SCP solution (Fig.3b), and could even
274 require fewer sites in total (Fig.3a), but the total cost of conserved sites are always equal to, or
275 more likely, greater than SCP solutions. Our simulation results showed the total cost of sites
276 selected for conservation in an $\sum\alpha$ offset market was only 2-11% greater than that using SCP, but
277 that this gap narrowed as the numbers of species increased (Fig.3c) because the flexibility by
278 which all targets could be achieved was reduced. Conservation solutions selected by the market
279 were more expensive than networks selected by SCP because these minimize the total
280 agricultural value of properties included (WTA), but do not consider whether the sites also provide
281 high returns to developers (WTP). While high $\sum\alpha$ values and associated offset costs would
282 incentivize developers to consider alternatives for development to some sites in the SCP network,
283 if WTP is still sufficiently high to be profitable, then the offset market must settle for a more
284 expensive complement of sites to replace them. The basis of SCP is that priorities are not simply
285 cheapest or the most ecologically diverse, but those sites that best complement and add to what
286 is already conserved. This principle ensures that given the changing constraints present at the

287 time of trading, all conservation targets are still met as efficiently as possible, minimizing the
288 overall cost to society.

289 **Irreplaceability is ecologically and economically superior to simpler offset metrics**

290 Finally, we compared the ecological and economic performance of an $\sum\alpha$ led offset market with
291 three alternative offset metrics (OM) for the same simulated landscape; OM1 weighted site
292 scores by the inverse of each species range, thereby favoring the rarest taxa in the landscape
293 (Crisp et al. 2001); OM2 was equivalent to OM1, but values for each planning unit were not
294 updated over time meaning weights for each species were fixed at their starting value; and OM3
295 was based solely on how many species were present. Our results showed that markets where
296 trade was governed by these three alternative metrics typically failed to achieve all their targets
297 (2%, 22% and 1% for OM1-OM3 respectively), even when property values were increased to
298 support continued trading (Fig. 4). OM2, in which sites were weighted by species rarity, was only
299 more successful because targets in all our scenarios were directly proportional to their availability,
300 and hence this was the only situation where fixed weighting could sometimes be appropriate. Yet
301 the few occasions when alternative metrics did achieve all targets relied upon the subset of
302 species selected to have narrow distributions which restricted the flexibility of selection. Where
303 successful, solutions were achieved with a higher number of sites and at greater cost (115-
304 130%), and none were successful for a larger number of species.

305 **Discussion**

306 Land use and land management are central to addressing challenges of global biodiversity
307 conservation, as well as food security, poverty alleviation and climate change mitigation
308 (Meyfroidt et al. 2022). The failure to coordinate appropriate and effective actions across sectors
309 not only undermines commitments to drive a recovery of Nature, but it also further risks the
310 sustained wellbeing of people. In this study, we have demonstrated that if relevant parties engage
311 in trading of biodiversity credits based on a metric derived from $\sum\alpha$ -irreplaceability, an offset
312 market can support the most efficient trajectory toward all conservation targets. That is, designing

313 an offset market with $\sum\alpha$ -irreplaceability as its metric delivers a low-cost way of meeting
314 biodiversity targets.

315 Our approach challenges the current school of thought that to ensure no net loss (or achieve a
316 net gain in biodiversity), “like-for-like” trading should be mandatory within a policy design (Bull et
317 al. 2015; zu Ermgassen et al. 2020). As a metric, $\sum\alpha$ -irreplaceability relaxes the need for
318 equivalent species in each transaction, and instead motivates restoration of species and
319 ecosystems in greatest need (relative to targets), and where that action is most efficient
320 economically. This element of prioritization ensures offsetting conserves the most important sites
321 and at-risk species first, irrespective of whether they face direct development pressure. Indeed,
322 the rationale for such prioritization is entirely transparent, and although many targets are
323 combined to effectively rank each site, this can easily be traced back to its value for different
324 conservation targets. Previous research has hypothesized that increasing the complexity of offset
325 trading metrics, in a similar vein to $\sum\alpha$ -irreplaceability, is likely to reduce the number of trades and
326 hence the economic efficiency of the policy instrument (Needham et al. 2019). In contrast, we
327 demonstrate that simpler metrics are unlikely to achieve their primary goal or guide effective
328 progress toward conservation targets. We also show that the economic cost of solutions based
329 on $\sum\alpha$ -irreplaceability were not dependent on the number of conservation targets considered. In
330 line with previous research, we demonstrate that the location of offset sites and overall cost of
331 conservation actions is dictated by the overlap among ecological targets, and with ecological and
332 economic heterogeneity across the landscape (Doyle & Yates 2010; Kangas & Ollikainen 2019;
333 Drechsler 2021; Simpson et al. 2022). Finally, if we select conservation targets that exceed
334 species’ initial availability because we anticipate restoration potential, then net gain, rather than
335 no net loss, is achieved at the market-scale.

336 The adoption of systematic planning tools allows conservation objectives to be achieved
337 efficiently, but rather than relying on new national parks and reserves to stall biodiversity loss, our
338 intention is to recognize the value of effective off-reserve management (Wilson et al. 2007), and

339 engaging private finance in conservation. Systematic conservation planning algorithms may
340 define “optimal” solutions to meet all conservation targets, but in practice these networks are hard
341 to implement when land is privately owned and landowner decisions are based on the relative
342 payoffs from alternative uses (Knight et al. 2011; McIntosh et al. 2017). By introducing regulations
343 requiring developers to offset the predicted impacts of development on biodiversity, a biodiversity
344 offset market generates a positive financial return for farmers investing in conservation that does
345 not exist prior to this market being created. Our study demonstrates that $\sum\alpha$ -irreplaceability is an
346 effective market metric to allow farmers and developers to independently engage in trades, while
347 ensuring an underlying strategic approach is taken to secure the targets deemed critical to
348 biodiversity conservation.

349 An ongoing problem in the successful implementation of biodiversity offset markets, and
350 environmental markets more broadly, is the lack of regulatory capacity to implement the program
351 with an emphasis on the follow up monitoring of newly created sites (BenDor et al. 2009; Brownlie
352 et al. 2017; zu Ermgassen et al. 2021). Similarly, a market based on the $\sum\alpha$ metric could
353 potentially result in higher transactions costs. The metric is dynamic as the values of sites would
354 ideally be recomputed after each successful trade. The uncertainty these updates create may
355 lead to lower gains from trade being realised, eroding the ability of the offset market to deliver
356 conservation actions cost-effectively. We have not addressed these potential costs in our study.

357 **How can we avoid previous mistakes? Effective asset management requires monitoring.**

358 The quality of our knowledge of biodiversity is critical to estimating the appropriate allocation of
359 land for conservation and to quantify trade-offs. Rather than rating performance according to the
360 resources or finance committed, $\sum\alpha$ credits provide the greatest reward to landowners able to
361 deliver high marginal gains in ecological outcomes at low financial cost (Pressey et al. 2021).
362 However, to identify the importance of a site to achieving conservation targets, $\sum\alpha$ -irreplaceability
363 credits combine knowledge of how ecological assets are distributed throughout the market’s
364 jurisdiction, not just within sites associated with offset trading. Such information is not static and

365 should also be updated routinely by the market metric to reflect their changing stocks. Note the
366 same information would still be required to weight the alternative metrics in Figure 4, but they
367 typically failed to achieve conservation goals because they cannot recognize when losses would
368 be regarded as irreplaceable. Given that inadequate monitoring has been cited as a key
369 constraint to global action for many years (Pressey et al. 2021), as well as in the context of prior
370 attempts to organize biodiversity markets (Maron et al. 2012; zu Ermgassen et al. 2021; Kujala et
371 al. 2022) a change in approach is required if biodiversity is to be valued correctly.

372 Firstly, a key principle underpinning $\sum\alpha$ -irreplaceability market offsets is that losses to
373 development are not sanctioned if they cannot be replaced. It is key the market should represent
374 as many asset types as possible, even if their distribution is uncertain, to avoid unintentional
375 losses of biodiversity being permitted because those features were absent from $\sum\alpha$ calculation
376 (Popov et al. 2022). In this context the value of ecological monitoring data gains new meaning. If
377 our understanding of an ecological feature like species distribution, is poor, we should err on the
378 side of caution and protect a higher number of sites to be confident we have reached a target
379 (IUCN 2007). Without this prudent approach, land and ecological assets upon which society
380 depends may be lost before we have the knowledge to react. If caution due to data shortages
381 leads to an over-estimation of the area required to achieve targets, this increases the difficulty of
382 achieving targets and consequently the financial costs of offsetting for developers. It would
383 therefore be in the interests of both market regulators and developers to improve monitoring to
384 minimize the uncertainty of site's $\sum\alpha$ -irreplaceability, balancing the cost of further monitoring
385 against expected efficiency gains for the market (Bolam et al. 2019; Eyvindson et al. 2019). In
386 addition, while the cost of monitoring has traditionally been prohibitive, modern tools such as
387 acoustics, molecular methods, automated imaging and remote surveys from drone and satellites
388 have dramatically increased our ability to monitor many ecological systems at scale (Keitt &
389 Abelson Eric 2021; Besson et al. 2022). It is beyond the scope of this paper to provide an
390 overview of these methods, but the capacity to efficiently verify restoration outcomes is growing,

391 particularly if sampling design can be strategically adapted to minimize uncertainties in $\sum\alpha$
392 (Brown et al. 2013).

393 The biodiversity market is created by a demand for credits. In our simulated market, trading is
394 enforced by a regulator, rather than emerging from a voluntary demand for credits. However, the
395 guarantees that conservation targets will be safeguarded and eventually achieved cannot be
396 made if developers participation in offset trading is voluntary. The market regulator receives
397 updates from monitoring sources to maintain oversight of each asset's progress toward targets at
398 the market-scale, thereby determining local site $\sum\alpha$ scores and the credits required for trades
399 (Kujala et al. 2022). The regulator is also able to intervene in the economic efficiency of the
400 market, for example by subsidizing restoration costs on farms to increase the market supply of
401 $\sum\alpha$ -irreplaceability credits. While we recognize defining site $\sum\alpha$ -irreplaceability based on the
402 potential recovery of a site is challenging (Sutherland 2022), including forecasting of the
403 timeframe and risks (Laitila et al. 2014; Ladouceur et al. 2023), those uncertainties are
404 motivations for targeted research, rather than barriers to adoption (Bolam et al. 2019; Eyvindson
405 et al. 2019). Public support and trust will be strengthened by the transparency with which
406 individuals can understand how local, and potentially highly visible, losses are accompanied by
407 secure landscape gains designed to benefit society and the economy (Cvitanovic et al. 2021). We
408 also note that landowners with spatial, strategic advantages due to the location of their land may
409 be able to leverage payments from developers which are well in excess of their opportunity costs,
410 where their property is key to achieving a conservation target (Lennox et al. 2012).

411 **Beyond biodiversity offset markets**

412 Even with introduction of planning regulation, to avert substantial biodiversity loss and
413 degradation of ecosystem services, we must raise our ambitions to begin restoring ecosystems
414 (Leclère et al. 2020). The resources available for conservation action are woefully inadequate
415 compared to the resources invested in activities that further degrade or destroy nature (Dasgupta
416 2021), and yet the expected benefits of conservation investment often far outweigh the costs

417 (Bradbury et al. 2021; DEFRA 2022). The evidence of an ecological crisis is so serious that any
418 action or investment is seen as positive, but this lack of discrimination also weakens the
419 motivation of individuals and companies to support more transformative change. $\sum\alpha$ -
420 irreplaceability credits can be used to recognize and reward private investment in conservation
421 because they provide a comparable metric of performance within a market, even if two sites or
422 actions impact different ecological assets.

423 Within an $\sum\alpha$ -irreplaceability market, an investor could anticipate the relative costs of their actions
424 and define the performance of their investments in restoration and conservation for biodiversity in
425 “net” terms. $\sum\alpha$ -irreplaceability could therefore be key to allowing fair recognition of investors’
426 contributions, while building public trust that companies statements of environmental
427 responsibility match their claims.

428 The debates associated with pathways to sustainability and a nature positive recovery are highly
429 value laden, “wicked” problems (DeFries & Nagendra 2017; Meyfroidt et al. 2022), but we cannot
430 expect ecosystem recovery to emerge from a piecemeal approach. Land is finite, and reconciling
431 demands and interactions of complex multisector systems requires strategic oversight to avoid
432 scenarios of ecological, economic and societal collapse (Steffen et al. 2015; Shin et al. 2022).
433 Ecologists can identify what targets are required as a *minimum* to sustain species, ecosystem or
434 process, but targets must ultimately be defined collaboratively with economists, social scientists,
435 health economists and politicians. Incentivizing outcomes using insights from systematic planning
436 will become increasingly important as the collective benefits of multiple land uses diverge
437 (Moilanen et al. 2005; Jung et al. 2021). Adopting $\sum\alpha$ -irreplaceability would enable authorities to
438 identify and minimize the conflict between conservation targets and other land uses, thereby
439 incentivizing greater private sector investment in actions that accelerate the speed with which we
440 can achieve Nature’s recovery.

441

442 **References**

- 443 Armstrong McKay DI, Staal A, Abrams JF, Winkelmann R, Sakschewski B, Loriani S, Fetzer I,
444 Cornell SE, Rockström J, Lenton TM. 2022. Exceeding 1.5°C global warming could trigger
445 multiple climate tipping points. *Science* **377**:eabn7950.
- 446 Baisero D, Schuster R, Plumptre AJ. 2021. Redefining and mapping global irreplaceability.
447 *Conservation Biology* **36**:e13806.
- 448 Ban NC, et al. 2013. A social–ecological approach to conservation planning: embedding social
449 considerations. *Frontiers in Ecology and the Environment* **11**:194-202.
- 450 BBOP. 2009. Business and Biodiversity Offsets Programme: Biodiversity Offset Design Handbook.
451 Washington D.C., Available from: [https://www.forest-](https://www.forest-trends.org/publications/biodiversity-offset-design-handbook/)
452 [trends.org/publications/biodiversity-offset-design-handbook/](https://www.forest-trends.org/publications/biodiversity-offset-design-handbook/).
- 453 BenDor T, Sholtes J, Doyle MW. 2009. Landscape characteristics of a stream and wetland
454 mitigation banking program. *Ecological Applications* **19**:2078-2092.
- 455 Besson M, Alison J, Bjerge K, Gorochowski TE, Høye TT, Jucker T, Mann HMR, Clements CF. 2022.
456 Towards the fully automated monitoring of ecological communities. *Ecology Letters*
457 **25**:2753-2775.
- 458 Bolam FC, Grainger MJ, Mengersen KL, Stewart GB, Sutherland WJ, Runge MC, McGowan PJK.
459 2019. Using the Value of Information to improve conservation decision making.
460 *Biological Reviews* **94**:629-647.
- 461 Bradbury RB, et al. 2021. The economic consequences of conserving or restoring sites for
462 nature. *Nature Sustainability* **4**:602-608.
- 463 Brown JA, Salehi M M, Moradi M, Panahbehagh B, Smith DR. 2013. Adaptive survey designs for
464 sampling rare and clustered populations. *Mathematics and Computers in Simulation*
465 **93**:108-116.
- 466 Brownlie S, von Hase A, Botha M, Manuel J, Balmforth Z, Jenner N. 2017. Biodiversity offsets in
467 South Africa – challenges and potential solutions. *Impact Assessment and Project*
468 *Appraisal* **35**:248-256.
- 469 Bryan BA, Raymond CM, Crossman ND, Macdonald DH. 2010. Targeting the management of
470 ecosystem services based on social values: Where, what, and how? *Landscape and*
471 *Urban Planning* **97**:111-122.
- 472 Bull JW, Hardy MJ, Moilanen A, Gordon A. 2015. Categories of flexibility in biodiversity
473 offsetting, and their implications for conservation. *Biological Conservation* **192**:522-532.
- 474 Bull JW, Milner-Gulland EJ, Suttle KB, Singh NJ. 2014. Comparing biodiversity offset calculation
475 methods with a case study in Uzbekistan. *Biological Conservation* **178**:2-10.
- 476 Crisp MD, Laffan S, Linder HP, Monro A. 2001. Endemism in the Australian flora. *Journal of*
477 *Biogeography* **28**:183-198.
- 478 Cvitanovic C, Shellock RJ, Mackay M, van Putten EI, Karcher DB, Dickey-Collas M, Ballesteros M.
479 2021. Strategies for building and managing ‘trust’ to enable knowledge exchange at the
480 interface of environmental science and policy. *Environmental Science & Policy* **123**:179-
481 189.
- 482 Dasgupta P. 2021. *The Economics of Biodiversity: The Dasgupta Review*. London.
- 483 DEFRA. 2022. Environment Act targets: Summary of evidence and approach. . Online:
484 [https://consult.defra.gov.uk/natural-environment-policy/consultation-on-](https://consult.defra.gov.uk/natural-environment-policy/consultation-on-environmental-targets)
485 [environmental-targets](https://consult.defra.gov.uk/natural-environment-policy/consultation-on-environmental-targets).
- 486 DeFries R, Nagendra H. 2017. Ecosystem management as a wicked problem. *Science* **356**:265-
487 270.

488 Díaz S, et al. 2019. Pervasive human-driven decline of life on Earth points to the need for
489 transformative change. *Science* **366**:eaax3100.

490 Doyle MW, Yates AJ. 2010. Stream ecosystem service markets under no-net-loss regulation.
491 *Ecological Economics* **69**:820-827.

492 Drechsler M. 2021. Bundling of Ecosystem Services in Conservation Offsets: Risks and How They
493 Can Be Avoided. Land DOI: 10.3390/land10060628.

494 Eyvindson K, Hakanen J, Mönkkönen M, Juutinen A, Karvanen J. 2019. Value of information in
495 multiple criteria decision making: an application to forest conservation. *Stochastic
496 Environmental Research and Risk Assessment* **33**:2007-2018.

497 Ferrier S, Pressey RL, Barrett TW. 2000. A new predictor of the irreplaceability of areas for
498 achieving a conservation goal, its application to real-world planning, and a research
499 agenda for further refinement. *Biological Conservation* **93**:303-325.

500 Hanson JO, Schuster R, Morrell N, Strimas-Mackey M, Edwards BPM, Watts ME, Arcese P,
501 Bennett J, Possingham HP. 2022. prioritizr: Systematic Conservation Prioritization in R. R
502 package version 7.2.2, Available at <https://CRAN.R-project.org/package=prioritizr>.

503 IPBES. 2019. Global assessment report on biodiversity and ecosystem services of the
504 Intergovernmental Science- Policy Platform on Biodiversity and Ecosystem Services.
505 Bonn, Germany.

506 IUCN. 2007. Guidelines for applying the precautionary principle to biodiversity conservation and
507 natural resource management. As approved by the 67th meeting of the IUCN council
508 14–16 May 2007.

509 IUCN. 2022. Egyptian COP27 Presidency, Germany and IUCN announce ENACT Initiative for
510 Nature-based Solutions. Online. Available at:
511 <https://cop27.eg/#/presidency/initiative/enact>.

512 Jung M, et al. 2021. Areas of global importance for conserving terrestrial biodiversity, carbon
513 and water. *Nature Ecology & Evolution* **5**:1499-1509.

514 Kangas J, Ollikainen M. 2019. Economic Insights in Ecological Compensations: Market Analysis
515 With an Empirical Application to the Finnish Economy. *Ecological Economics* **159**:54-67.

516 Keitt T, H., Abelson Eric S. 2021. Ecology in the age of automation. *Science* **373**:858-859.

517 Knight AT, Grantham HS, Smith RJ, McGregor GK, Possingham HP, Cowling RM. 2011. Land
518 managers' willingness-to-sell defines conservation opportunity for protected area
519 expansion. *Biological Conservation* **144**:2623-2630.

520 Kujala H, et al. 2022. Credible biodiversity offsetting needs public national registers to confirm
521 no net loss. *One Earth* **5**:650-662.

522 Kukkala AS, Moilanen A. 2013. Core concepts of spatial prioritisation in systematic conservation
523 planning. *Biological Reviews* **88**:443-464.

524 Ladouceur E, Isbell F, Clark AT, Harpole WS, Reich PB, Tilman GD, Chase JM. 2023. The recovery
525 of plant community composition following passive restoration across spatial scales.
526 *Journal of Ecology* **111**:814-829.

527 Laitila J, Moilanen A, Pouzols FM. 2014. A method for calculating minimum biodiversity offset
528 multipliers accounting for time discounting, additionality and permanence. *Methods in
529 Ecology and Evolution* **5**:1247-1254.

530 Leclère D, et al. 2020. Bending the curve of terrestrial biodiversity needs an integrated strategy.
531 *Nature* **585**:551-556.

532 Lennox GD, Dallimer M, Armsworth PR. 2012. Landowners' ability to leverage in negotiations
533 over habitat conservation. *Theoretical Ecology* **5**:115-128.

534 Leroy B, Meynard CN, Bellard C, Courchamp F. 2016. virtualspecies, an R package to generate
535 virtual species distributions. *Ecography* **39**:599-607.

536 Margules CR, Pressey RL. 2000. Systematic conservation planning. *Nature* **405**:243-253.

537 Maron M, Hobbs RJ, Moilanen A, Matthews JW, Christie K, Gardner TA, Keith DA, Lindenmayer
538 DB, McAlpine CA. 2012. Faustian bargains? Restoration realities in the context of
539 biodiversity offset policies. *Biological Conservation* **155**:141-148.

540 Marshall E, Wintle BA, Southwell D, Kujala H. 2020. What are we measuring? A review of metrics
541 used to describe biodiversity in offsets exchanges. *Biological Conservation* **241**:108250.

542 McIntosh EJ, Pressey RL, Lloyd S, Smith RJ, Grenyer R. 2017. The Impact of Systematic
543 Conservation Planning. *Annual Review of Environment and Resources* **42**:677-697.

544 Meyfroidt P, et al. 2022. Ten facts about land systems for sustainability. *Proceedings of the
545 National Academy of Sciences* **119**:e2109217118.

546 Moilanen A, Franco AMA, Early RI, Fox R, Wintle B, Thomas CD. 2005. Prioritizing multiple-use
547 landscapes for conservation: methods for large multi-species planning problems.
548 *Proceedings of the Royal Society B: Biological Sciences* **272**:1885-1891.

549 Moilanen A, Wilson KA, Possingham H 2009. *Spatial Conservation Prioritization: Quantitative
550 Methods and Computational Tools*. Oxford University Press, Oxford.

551 Natural England. 2022. Biodiversity Metric 3.1: Auditing and accounting for biodiversity – User
552 Guide. London.

553 Needham K, de Vries FP, Armsworth PR, Hanley N. 2019. Designing markets for biodiversity
554 offsets: Lessons from tradable pollution permits. *Journal of Applied Ecology* **56**:1429-
555 1435.

556 NSW DPE. 2022. Biodiversity credit pricing guide: Guidance for pricing biodiversity credits under
557 the Biodiversity Offsets Scheme. Parramatta, NSW.

558 Popov V, Shah P, Runting RK, Rhodes JR. 2022. Managing risk and uncertainty in systematic
559 conservation planning with insufficient information. *Methods in Ecology and Evolution*
560 **13**:230-242.

561 Pressey RL, Humphries CJ, Margules CR, Vane-Wright RI, Williams PH. 1993. Beyond
562 opportunism: Key principles for systematic reserve selection. *Trends in Ecology &
563 Evolution* **8**:124-128.

564 Pressey RL, Visconti P, McKinnon MC, Gurney GG, Barnes MD, Glew L, Maron M. 2021. The
565 mismeasure of conservation. *Trends in Ecology & Evolution* **36**:808-821.

566 Radu C, Caron M-A, Arroyo P. 2020. Integration of carbon and environmental strategies within
567 corporate disclosures. *Journal of Cleaner Production* **244**:118681.

568 Schmalensee R, Stavins RN. 2017. The design of environmental markets: What have we learned
569 from experience with cap and trade? *Oxford Review of Economic Policy* **33**:572-588.

570 Sciaini M, Fritsch M, Scherer C, Simpkins CE. 2018. NLMR and landscapetools: An integrated
571 environment for simulating and modifying neutral landscape models in R. *Methods in
572 Ecology and Evolution* **9**:2240-2248.

573 Shin Y-J, et al. 2022. Actions to halt biodiversity loss generally benefit the climate. *Global Change
574 Biology* **28**:2846-2874.

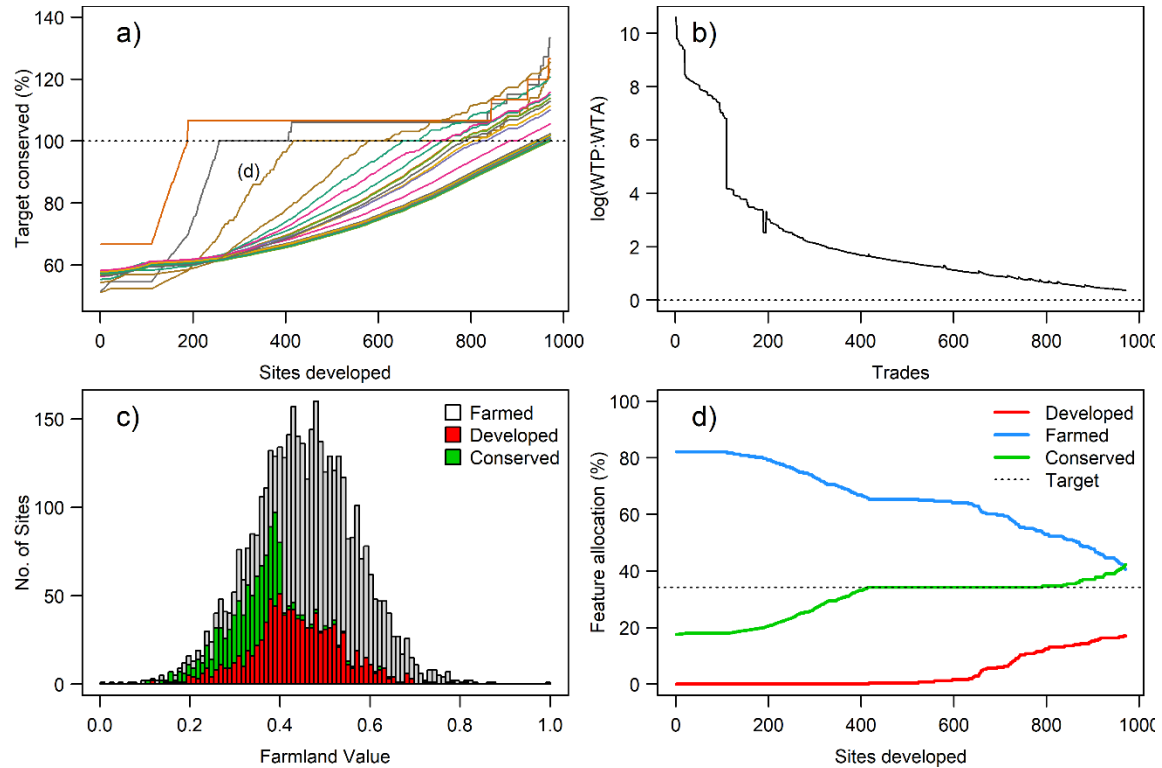
575 Simpson KH, de Vries F, Dallimer M, Armsworth PR, Hanley N. 2021. Understanding the
576 Performance of Biodiversity Offset Markets: Evidence from An Integrated Ecological -
577 Economic Model. *Land Economics*:030420-030032R.

- 578 Simpson KH, de Vries FP, Dallimer M, Armsworth PR, Hanley N. 2022. Ecological and economic
579 implications of alternative metrics in biodiversity offset markets. *Conservation Biology*
580 **36**:e13906.
- 581 Steffen W, et al. 2015. Planetary boundaries: Guiding human development on a changing planet.
582 *Science* **347**:1259855.
- 583 Sutherland WJ. 2022. *Transforming Conservation: A Practical Guide to Evidence and Decision*
584 *Making*. Open Book Publishers <https://doi.org/10.11647/OBP.0321>, Cambridge, UK.
- 585 Tittensor DP, et al. 2014. A mid-term analysis of progress toward international biodiversity
586 targets. *Science* **346**:241-244.
- 587 Wilson KA, et al. 2007. Conserving Biodiversity Efficiently: What to Do, Where, and When. *PLOS*
588 *Biology* **5**:e223.
- 589 Yong DL, Barton PS, Ikin K, Evans MJ, Crane M, Okada S, Cunningham SA, Lindenmayer DB. 2018.
590 Cross-taxonomic surrogates for biodiversity conservation in human-modified landscapes
591 – A multi-taxa approach. *Biological Conservation* **224**:336-346.
- 592 zu Ermgassen SOSE, Baker J, Griffiths RA, Strange N, Struebig MJ, Bull JW. 2019. The ecological
593 outcomes of biodiversity offsets under “no net loss” policies: A global review.
594 *Conservation Letters* **12**:e12664.
- 595 zu Ermgassen SOSE, Maron M, Corlet Walker CM, Gordon A, Simmonds JS, Strange N, Robertson
596 M, Bull JW. 2020. The hidden biodiversity risks of increasing flexibility in biodiversity
597 offset trades. *Biological Conservation* **252**:108861.
- 598 zu Ermgassen SOSE, Marsh S, Ryland K, Church E, Marsh R, Bull JW. 2021. Exploring the
599 ecological outcomes of mandatory biodiversity net gain using evidence from early-
600 adopter jurisdictions in England. *Conservation Letters* **14**:e12820.

601

602

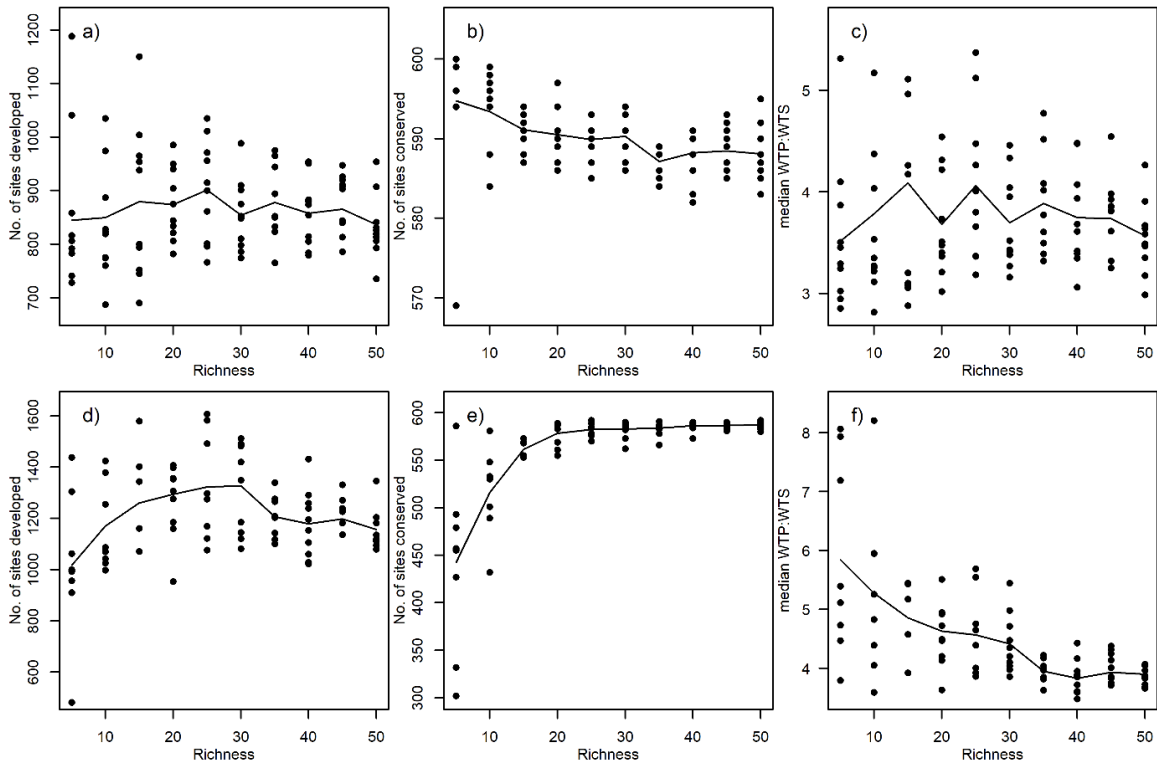
603
604
605



606

607 **Figure 1.** Example of $\Sigma\alpha$ -irreplaceability offset market for 25 simulated species. Panel a) indicates
608 the progress of each species toward its conservation targets (dotted line) as new developments
609 requiring offsets take place. Panel b) illustrates the decline in the log ratio between willingness to
610 pay (WTP) and willingness to accept (WTA) as representative of gains from trade, and c) displays
611 the distribution of values for purchasing agricultural land in this simulated landscape, and the final
612 proportion of those that were selected for development and conservation offsets. Panel d) displays
613 the changes in the allocation of a single species (also identified in panel a) among land types as
614 trading progresses.

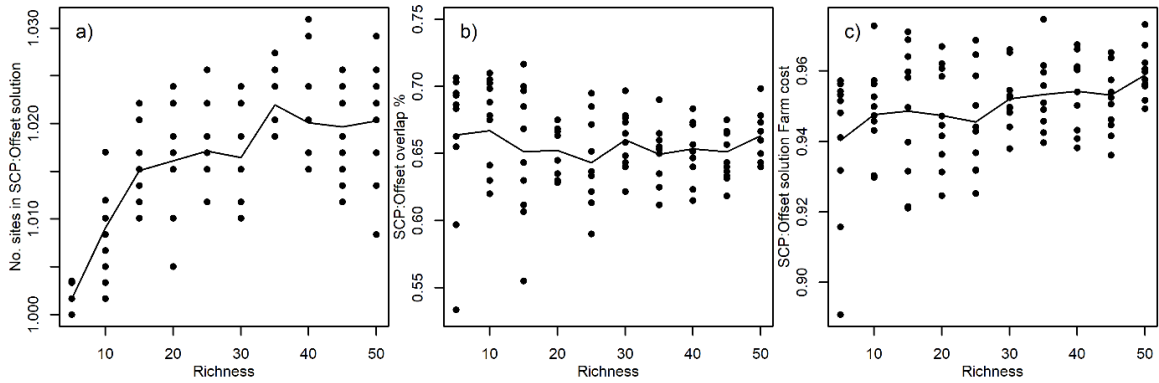
615



617
 618
 619
 620
 621
 622
 623
 624
 625

Figure 2. Variation $\sum \alpha$ -irreplaceability market trading outcomes when the richness of communities is increased. Assemblages were drawn from communities of 200, with either a strong richness gradient (a,b,c) or no richness gradient (d,e,f). The columns show the number of sites selected for development (a & d), the number of sites required for conservation (b & e) and the median ratio between willingness to pay (WTP) and willingness to accept (WTA) (c & e). All conservation targets were achieved in each market simulation and lines of best fit were added based on local polynomial regression.

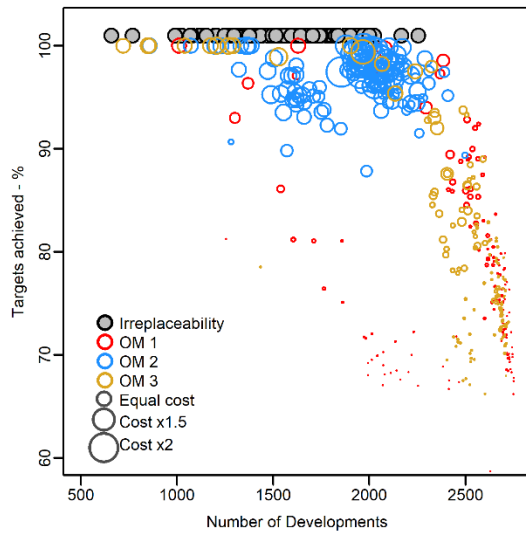
626



627
628
629
630
631
632
633
634
635

Figure 3. Illustration of a comparison between conservation networks selected by $\Sigma\alpha$ -irreplaceability market trading and “optimal” planning outcomes for simulated community with a strong richness gradient. Panel a) plots the ratio of network size when the richness of communities is increased; panel b) the percentage of planning units that are shared with the optimal network, and panel c) the ratio of network cost.

636



637

638 **Figure 4.** Comparison of conservation solution efficiency when guided by systematic conservation
639 planning (SCP), or an offset market based on $\sum\alpha$ -irreplaceability, and three alternative offset
640 metrics described in the main text (O1-O3). Panel a) displays the total cost of agricultural land with
641 the increasing richness of simulation scenarios, and panel b) displays the number of planning units
642 that were Developed or entered into Conservation offsets. To make outcomes comparable only
643 solutions that achieved >99% of targets are displayed. Note the solutions proposed by SCP are not
644 associated with Development but are added to the plot to indicate the number of planning units
645 conserved.

646

647

648

649