

Ecological and Economic Implications of Alternative Metrics in Biodiversity Offset Markets

Abstract

Consideration of the incentives facing both landowners as potential biodiversity offset providers, and developers as potential buyers of credits, is critical when considering the real-world policy implications of choosing a specific offset metric and the resultant impacts on biodiversity. The expectation is that the least profitable land parcels are the ones most likely to be conserved, which determines the spatial location of biodiversity offset credits. We developed an ecological-economic model to compare the ecological and economic outcomes of offsetting for a habitat-based metric and a species-based metric. We were interested in whether these metrics would adequately capture the indirect benefits of offsetting on species not defined under the no net loss policy. We simulated a biodiversity offset market for a case study landscape, linking species distribution modelling and an economic model of landowner choice based on economic returns of the alternative land management options (restore, develop, or maintain existing land use). The biodiversity offset markets for the habitat and species metrics achieved no net loss of the intended metric. However, the underlying species distributions, layered with the agricultural and development rental values of parcels, resulted in very different landscape outcomes depending on. Neither metric adequately captured the indirect benefits of offsetting on related habitats or species. Where policymakers are aiming for the metric to act as an indicator to mitigate impacts on a range of closely related habitats and species, then a simple no net loss target is not adequate. Furthermore, if we wish to secure the most ecologically beneficial design of offsets policy, we need to understand the economic decision-making processes of the landowners.

27 **Keywords:**

28 Biodiversity metrics. No net loss. Biodiversity loss. Simulation model.

29 **Article Impact Statement:**

30 Design policies that offer the highest incentives for conserving and enhancing the most ecologically
31 beneficial sites in a landscape.

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35 **Introduction**

36 Goal 15 of the UN Sustainable Development Goals is to halt and reverse land degradation and the
37 associated loss of biodiversity (United Nations 2015). However, the human population is predicted to
38 reach 8.6 billion by 2030, an increase of 1 billion from 2020 (United Nations 2017): consequently,
39 ceasing human development impacts (including new housing and infrastructure) is not an option
40 (United Nations 2019). Instead, tools are needed which allow us to reconcile development pressures
41 with biodiversity conservation. Biodiversity offsets are one such policy option that is becoming
42 increasingly applied to respond to these pressures (Moilanen & Kotiaho 2020).

43 Biodiversity offsets provide ‘measurable conservation outcomes resulting from actions designed to
44 compensate for significant residual adverse biodiversity impacts’ (BBOP 2009). Offsetting is
45 considered the final step in the mitigation hierarchy once all other steps (avoid, minimize, restore)
46 have been undertaken (Alridge et al 2019). The majority of offset policies target no net loss of
47 biodiversity, where losses due to development are matched through gains in biodiversity elsewhere
48 (zu Ermgassen et al 2019). More recently, the focus has been shifting towards Net Positive Impact
49 and Biodiversity Net Gain, which aim to improve the state of the environment compared to the pre-
50 development state (Bull & Brownlie 2017; Moilanen & Kotiaho 2020; McVittie & Faccioli 2020).

51 In this paper, we focus on markets for biodiversity offsets. These markets are created when multiple
52 buyers and sellers of offsets interact with others through a trading process, typically moderated by an
53 offset bank or regulator (Needham et al 2020). Landowners can choose to manage land for
54 conservation, generating offset credits which can then be sold to a developer who is required to
55 mitigate development impacts, for example from house building, on some measure of biodiversity. By
56 establishing an appropriate rate of exchange between sellers and buyers, markets can, in theory,
57 achieve no net loss of biodiversity (or a net gain) within some defined area at least cost.

58 One of the most contentious issues in the design of offsetting schemes is the choice of the offset
59 metric: how gains and losses in biodiversity are assessed and compared. This metric forms the trading
60 unit within an offset market. Across the disciplines of economics and ecology, the choice of metric is

61 seen as critical in determining the success of offsetting as a policy instrument (Heal 2005; Bull et al
62 2013). From an economic perspective, markets require goods to be grouped into simple, measurable,
63 standardized units to foster exchangeability and market efficiency (Salzman and Ruhl 2001).

64 However, it is difficult to translate biodiversity into a simple metric as part of a market exchange
65 mechanism (Bull et al 2013). Many of the widely used offset metrics use a combination of habitat
66 area, vegetation, and site condition scores (Parkes 2003; Bull et al 2014; zu Ermgassen 2019). There
67 is an expectation from the policy community that these metrics will adequately capture many of the
68 indirect benefits of offsetting, such as increasing the numbers of other, non-target plant and animal
69 species (Cristescu et al 2013; Marshall et al 2020a). However, the evidence thus far has demonstrated
70 that these approaches rarely achieve no net loss of biodiversity (Maron et al 2012; Bull et al 2014; zu
71 Ermgassen 2019).

72 Recent literature has begun to assess alternative offset metrics that include more detailed species data
73 and compare their performance with habitat-based metrics (Maseyk et al 2016; McVittie and Faccioli
74 2020; Marshall et al 2020b). However, there has been little quantitative work examining the economic
75 aspects of alternative offset metrics, and none within the context of a market. Consideration of the
76 incentives facing both landowners as potential offset providers, and developers as potential buyers of
77 credits, is critical when considering the real-world policy implications of choosing a specific offset
78 metric. Landowners base their decisions over whether to create offset credits on benefit/cost ratios of
79 competing, mutually exclusive land uses. The expectation is that the least profitable land parcels are
80 the ones most likely to be conserved, which determines the spatial location of credits (Drechsler,
81 2021). Developer's base decisions on the value of different parcels for development and the expected
82 costs of buying offsets. For both parties, the choice of the metric is likely to impact these decisions,
83 and thus on the spatial distribution of biodiversity, but no work to date has explored this.

84 To address this gap, we developed an ecological-economic model to compare the ecological and
85 economic outcomes of offsetting for two alternative metrics: one based on habitat and one based on
86 species. We compared these two metrics in the specific context of an offset market where farmers
87 supply credits to housebuilders who are required by law to acquire sufficient credits to offset the

88 predicted impacts of land-use change. We parameterized our model with data from a particular case
89 study system to ensure meaningful patterns of spatial variation were represented in the model. We
90 aimed to improve understanding of the relationship between the ecological and economic aspects of
91 offsetting, and how offset metric choice influences both components.

92 **Methods**

93 **Theoretical framework and hypotheses**

94 We developed a biodiversity offset market for an existing landscape but used a simplified decision-
95 making process. The landscape was divided into parcels, with each parcel owned by a single
96 landowner and classified as developed or undeveloped. We assumed that undeveloped land was
97 currently owned and managed by farmers and some developers wished to acquire this undeveloped
98 land for housing development. Farmers' default land use was assumed to be for agricultural purposes,
99 namely crop or livestock production.

100 Economic decisions were modelled based on the economic rent (profit) generated by each land parcel
101 in competing uses (development, agricultural land use, or conservation land use). We were interested
102 in comparing two types of rent: agricultural rent (defined as the difference between revenues from
103 crops/livestock and variable costs) and potential development rent of land for housing. We assumed
104 that for a farmer to switch from agriculture to conservation, the farmer must be offered a biodiversity
105 offset credit value equal at minimum to the agricultural rent forgone. That is, the farmer must believe
106 that the reduction in agricultural income on a given land parcel will be compensated for by the price
107 they can sell the resultant offset credit for. Conversely, for a developer, the potential rent from
108 housing development must be greater than rent under the current agricultural land use for them to
109 choose to develop new housing. In addition, a developer must factor in the need to purchase offset
110 credits to allow their development to proceed. We expected agricultural and development rents to vary
111 across the landscape due to differences in land productivity for farming and in house buyers'
112 preferences over where to live.

113 We focused first on an offset policy that aimed to secure no net loss of a specified *habitat* (our
114 approach could also be applied to a net gain policy, see Simpson et al 2021). Developers must
115 purchase credits equal to the number of hectares of habitat lost due to development. Farmers
116 undertake habitat creation and restoration actions on undeveloped land to generate these offset credits.
117 Credits are measured based on hectares of habitat created, with no weighting for habitat quality to
118 support certain species. As a result, the abundance of different species may increase or decrease
119 across the land parcels. We tested the following two hypotheses:

120 Hypothesis 1: *Trading habitats will lead to a net gain in species if the potential development rent is*
121 *negatively correlated to potential species abundance on sites that offer lower agricultural rent (and*
122 *are thus prone to being used for offsets of development).*

123 Hypothesis 2: *Trading habitats will lead to a net loss for species if the potential development rent is*
124 *positively correlated to potential species abundance on sites that offer lower agricultural rent (and*
125 *are thus prone to being used for offsets of development).*

126 There is an expectation that landowners are profit maximisers and such we expect that land parcels
127 with the highest predicted development rent will be developed first, and parcels that offer the highest
128 agricultural rents will remain farmland. Parcels with the lowest development rents and lowest
129 agricultural rents are more likely to be candidates for offset creation. Therefore, what we are
130 interested in is the correlation between development rent and species abundance on restored land
131 parcels. A policy target that focuses solely on habitat by default can benefits species where there is a
132 negative correlation between development rent and species abundance (Figure 1). In contrast, where
133 there is a positive correlation between development rent and species abundance, there will be a
134 decline in species abundance, despite no net loss of habitat.

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136 Our second offset policy focused on no net loss in the abundance of a specified *species*. Under this
137 policy, the regulator specifies a conservation-oriented land management practice that is expected to
138 benefit the species targeted by the no net loss policy. Farmers can choose to adopt this land
139 management practice and generate offset credits, which are measured and then awarded depending on
140 the predicted increase in abundance of the target species. Land parcels now have an ecological
141 weighting based on their predicted ability to support the species as specified in the policy target, in
142 contrast to the habitat metric case. The overall abundance of the target species will be maintained
143 across the landscape after offset trades take place since the no net loss rule governs the rate at which
144 development sites “lost” to conservation are substituted with “new” offset sites. However, the spatial
145 distribution of the target species is likely to change as a result of exchanging credits.

146 **Case Study Region and Offset Metric**

147 We applied our biodiversity offset model to the Inner Forth Estuary in central Scotland (Figure 2).
148 The region is characterized by a heavily industrialized estuary surrounded by increasingly urbanized
149 landscapes in the east, shifting towards low lying agricultural land and upland moors in the west.
150 Alongside agricultural land, undeveloped areas contain a mosaic of biodiversity-rich habitats
151 including semi-natural grasslands that are subject only to low-intensity use, wetlands, marshlands and
152 heather uplands, some of which are protected through the EU Habitats and Wildlife Birds Directive
153 (92/43/EEC and 2009/147/EC). However, biodiversity-rich areas out with these designated sites face
154 pressure from the growing population requiring new housing. As a result, our habitat-based policy
155 target is no net loss of low-intensity grassland. Low-intensity grassland is restored in our case study
156 by farmers removing livestock from currently grazed grassland or ceasing arable cropping practices
157 and creating new grassland. Costs associated with grassland conversion from arable land are minimal,
158 typically involving soil cultivation and seeding only.

159 To enable us to test our hypotheses, it was important to choose a species metric that aligned with the
160 no net loss of low-intensity grassland policy so that we could explore whether the landscape scale
161 outcomes were different under the habitat and species metrics. Therefore, we compared the no net loss
162 of low-intensity grassland metric with two species-based metrics: no net loss in the abundance of the

163 Eurasian curlew (*Numenius arquata*) and no net loss in the abundance of the northern lapwing
164 (*Vanellus vanellus*). Both of these species depend on access to suitable grassland during the breeding
165 season and consequently we expected that undertaking restoring low-intensity grassland on
166 agricultural land would increase the abundance of both species, hence generating offset credits. We
167 modeled the biodiversity offset market for each species independently so that we could explore the
168 ecological impact on the species not defined under the no net loss policy.

169 **Habitat, Species and Cost Data**

170 We divided our landscape into 1km² land parcels (100 ha); each land parcel contains data from five
171 spatially referenced datasets covering land classification, crop distribution, housing values and
172 protected area status, as well as lapwing and curlew abundance and distribution. Land use was
173 classified into 33 types including (Rowland et al 2015) and this allowed us to identify land parcels
174 suitable for development and agricultural land parcels suitable for low-intensity grassland restoration.

175 We assumed that new housing development could not take place within designated protected areas
176 (indicated in Figure 2) and also on certain habitat types (such as saltmarsh, fen, coniferous forest,
177 broadleaf forest, and inland rock habitats). The value of undeveloped land for new housing
178 development was calculated using HM Land Registry transactional data combined with the existing
179 land use classifications (see Appendix A for more details). We calculated the gross margin (rent) of
180 agricultural parcels by combining crop coverage with the associated gross margin data available in the
181 Farm Management Handbook (Beattie 2019).

182 We developed Species Abundance Models (SAMs) for lapwing and curlew to allow us to predict the
183 abundance of lapwing and curlew across the landscape under the current land use (Barker et al 2014).

184 We also used the SAMs to identify which agricultural land parcels could offer species offset credits if
185 the parcel was restored to low-intensity grassland (see Appendix B for more details on the SAM).

186 **The Ecological-Economic Model**

187 An agent-based model was developed in Stata MP (Version 16) to model landowners' choices based
188 on the relative economic returns of the alternative land management options for each parcel. The

189 model calculated the profitability of each land parcel for housing development, offset provision and
190 current land use. The model also identified the number of offset credits a parcel could supply if
191 restored to low-intensity grassland, and the number of offset credits required if the parcel were
192 developed for new housing. By integrating the profitability of the parcel with the potential offset
193 demand and supply, we were able to construct spatially explicit supply and demand curves for offset
194 credits. This allowed us to calculate the market-clearing (equilibrium) price for one offset credit.
195 Using this equilibrium price, we could then determine whether a land parcel remains under current
196 land use, supplied offsets or was developed for housing. Three landscape configurations were
197 generated using the three, alternative metrics. Using ArcGIS, we compared where development would
198 take place under each metric, how the distribution of low-intensity grassland would shift and the
199 changes in the abundance of lapwing and curlew. Based on this we examined whether no net loss of
200 low-intensity grassland could benefit the lapwing and curlew, or whether a more targeted species
201 metric was needed to secure the conservation of these species. For more details on the design of the
202 Agent-Based Model see Appendix C.

203 **Results**

204 **Habitat metric**

205 The biodiversity offset market secured no net loss of low-intensity grassland under the habitat metric:
206 4536 ha of grassland were to development and 4553 ha of grassland was restored. However, 345 of
207 the 409 land parcels developed contained at least one lapwing (Figure 3). This result by itself is not
208 concerning: all grassland parcels which are developed are offset. However, lapwing abundances were
209 found to be significantly lower ($M = 0.50$, $SD = 0.57$) on restored low intensity grassland parcels
210 compared lapwing abundances on the original grassland parcels ($M = 1.37$, $SD = 2.25$) ($t(145) =$
211 14.61 , $p < 0.001$). This resulted in a net loss of 674 lapwings. A similar result was found for curlew
212 (see Appendix D).

213 The decline in lapwing and curlew arises in part due to the non-uniformity of the bird populations
214 across the landscape but is also influenced by the characteristics on the demand side of the offset

215 market. We found that lapwing abundance and development rent were moderately positively
216 correlated ($r=0.08$, $n = 8347$, $p < 0.001$) (Figure 4). As a result, there was a disproportionate
217 conversion of low-intensity grassland habitat with high numbers of lapwing to new housing. As
218 shown in Figure 1, in principle at least, gradients in agricultural rent have the potential to alter the
219 choice whether to develop or not. However, for our case study, the result in Figure 4 is what drives
220 our findings because development rents tend to be substantially higher than agricultural rents (see
221 Appendix D for the correlation between lapwing abundance and agricultural rent). Consequently, our
222 results confirmed Hypothesis 2: trading habitats has led to a net loss in species with high development
223 rents correlated with lapwing abundance.

224

225

226 **Species metrics**

227 The two simulated species biodiversity offset market secured no net loss of the metric (no net loss of
228 lapwing under the lapwing metric, and no net loss of curlew under the curlew metric). The amount
229 and location of new housing development on low-intensity grassland were broadly similar for the
230 lapwing species metric (Figure 5) and curlew species metric (Figure 6). Development took place on
231 grassland parcels with low abundances of the target species. For the lapwing metric, the mean number
232 of lapwings lost to development per grassland parcel was 0.54. For the curlew metric, the mean
233 number of curlew lost to development per grassland parcel was 0.37. For both species, their respective
234 offset sites were located near the coastal margin and upland regions: both areas where predicted
235 abundance for lapwing and curlew was high. There was a significant difference in lapwing abundance
236 between the parcels that became offset supply sites ($M = 4.71$, $SD = 8.57$) and those that were either
237 developed or remained in the original land use ($M = 1.59$, $SD = 4.12$) ($t(8347) = 7.82$, $p < 0.001$)).
238 There was also significant difference in curlew abundance between the parcels that became offset
239 supply sites ($M = 3.62$, $SD = 5.93$) and those that were either developed or remained in the original
240 land use ($M = 1.22$, $SD = 2.25$) ($t(8347) = 8.83$, $p < 0.001$)).

241 **A comparison of habitat and species metrics**

242 The landscape-scale outcomes were substantially different depending on the choice of either a habitat
243 or species-based metric. The distribution of curlew and lapwing abundance was non-uniform across
244 grassland parcels throughout the landscape and as a result, there was divergence in grassland parcels
245 that are traded under the habitat and species metrics. To confirm this result, we compared the
246 equivalent costs of grassland credits under a uniform distribution of species across grassland parcels
247 (with a focus on no net loss of grassland) (Table 1). Under the grassland metric, a grassland offset
248 cost £499 per ha. The equivalent cost for this grassland offset using a uniform lapwing distribution
249 was £13,588 per bird, compared to £14,127 per lapwing using the non-uniform distribution. For
250 curlew, the equivalent cost for this grassland under the uniform curlew model was £19,683 per bird,
251 compared to £22,005 per curlew under the non-uniformly distributed curlew model (more detail is
252 provided on the calculation of this in Appendix D).

253 Consequently, significantly more low intensity grassland parcels were developed for housing under
254 the lapwing species metric ($M = 1.96$, $SD = 9.12$) compared to the grassland metric ($M = 0.54$, $SD =$
255 3.55) ($t(16696) = 13.27$, $p < 0.001$). Despite higher levels of development under the lapwing species
256 metric, there were fewer grassland offsets created. The increases in grassland under the habitat metric
257 ($M = 0.54$, $SD = 5.8$) were significantly greater than gains in grassland under the lapwing metric ($M =$
258 0.29 , $SD = 3.16$) ($t(16696) = 3.48$, $p < 0.001$). Consequently, there is a substantial loss of grassland
259 under the lapwing species metric (16,267 ha).

260 **Discussion and conclusions**

261 Using an ecological-economic modelling framework we simulated a biodiversity offset market that
262 secured no net loss of three alternative metrics: no net loss of low-intensity grassland (habitat-based),
263 no net loss lapwing (species based) and no net loss of curlew (species based) for a case study region.
264 The results revealed that for each of these metrics, no net loss of the target was secured but that there
265 were significant off-market ecological impacts.

266 The results show that none of the three metrics adequately captured the indirect benefits of offsetting
267 on related habitats or species. There were substantial declines in lapwing (loss of 678) and curlew
268 (loss of 964) under the no net loss of low-intensity grassland metric despite the ecological model (and
269 wider literature see Franks et al 2018 for a summary) highlighting that curlew and lapwings benefit
270 from restoration of low-intensity grassland. To put these declines in context, the most recent
271 population estimate for lapwing in Scotland is 71,500-105,600 pairs and 58,800 curlew pairs (Foster
272 et al 2013). Furthermore, under the species-based offset metrics, there were also declines in the non-
273 target species, (although not to as large an extent as under the grassland metric). There was a net loss
274 of 181 lapwings under the curlew metric and a net loss of 142 curlews under the lapwing metric.

275 The decline in lapwing and curlew under the grassland metric is related to the economic choices faced
276 by landowners. For a landowner to choose to become an offset supplier, this must be more profitable
277 than the current land use. The expectation is therefore that the least profitable land parcels are the
278 ones most likely to be conserved (Drechsler, 2021). For our case study we found that for lapwing and

279 curlew, there is a positive correlation between the predicted species abundance, the most profitable
280 parcels for agriculture and future development rents. As a result, parcels which are restored to create
281 new grassland-metric offset sites are unlikely to benefit curlew or lapwing. This result will not
282 necessarily hold in other landscapes, or for different metrics. Indeed, the opposite result is possible
283 where focusing on a simple no net loss of habitat policy target may result in increases in other plant
284 and animal species. We would expect to find this outcome where there is a negative correlation
285 between species abundance and expected development rents on sites that offer lower agricultural rent
286 (and are thus prone to being used for offsets of development). In such a situation, habitat-based
287 metrics would secure additional ecological gains and meet the policy community's anticipations that a
288 simpler metric can capture indirect ecological benefits. However, previous work has shown that
289 relying on a habitat-based metric to secure no net loss in a specific species is rarely successful
290 (Cristescu et al 2013; Quétier, Regnery and Levrel 2014; Marshall et al 2020b).

291 In contrast to the habitat-based metric, the species metric can be viewed more positively. The two
292 species-targeted offset markets resulted in outcomes where the highest value ecological sites were
293 protected, with no development taking place on low-intensity grassland parcels that contained more
294 than two lapwings or curlew. On the supply side, as expected, market-derived incentives encouraged
295 grassland restoration to take place on agricultural parcels which offered the greatest increases in
296 lapwing and curlew at the lowest opportunity cost but also pushed offset supply to focus on a few
297 high-value grassland sites in areas with already high numbers of curlew and lapwing. A consequence
298 of this was a significant decline in grassland area under both species-based metrics. A natural question
299 to ask would then be: is a large amount of habitat loss elsewhere what policymakers intended, or what
300 the general public want? From a societal perspective, this would result in a loss of easily accessible
301 greenspace and could have a significant impact on the wellbeing of local communities (Gordon-Jones
302 et al 2019; Griffiths et al 2019).

303 A further consideration for the species metric is the interplay between the economic and ecological
304 models. The economic model is designed to identify parcels that offer the most offsets at the lowest
305 cost (which it has achieved). However, this highlights the potential limitations in the underpinning

306 ecological models, which are less reliable for land parcels in areas in our region where data are sparse,
307 or for the few parcels that hold particularly high abundances of birds. Given that the economic model
308 focuses on identifying the smallest number of sites that can ensure no net loss in abundances, the
309 economic model will inevitably identify land parcels for which the uncertainty in our predicted
310 species abundances from the ecological models is highest.

311 We recognize that there are several limitations to our modelling approach. From an ecological
312 perspective, the modelling does not take into account temporal dynamics as we include no time lags
313 between losing an ecologically valuable land parcel to development and the offset site being created.
314 This is equivalent to assuming that the offset bank will only sell credits where and when the predicted
315 ecological benefit has already been realized. A dynamic model exploring ecological and economic
316 time scales would offer an interesting extension. There is also a need to expand the framework to
317 consider additional habitat types which qualify as offsets beyond grassland and to include the
318 restoration cost data associated with these habitat types. We have designed our offset market for an
319 existing UK landscape, but this approach could be replicated for other areas worldwide looking to
320 compare the landscape-scale impacts of different offset metrics for a trading scheme. The work could
321 also be expanded to take into account multiple environmental outcomes (rather than just changes in
322 habitats and species) or a broader range of biodiversity indicators (subject to data availability).

323 From a policy perspective, each of the metrics considered here achieves their intended policy targets:
324 no net loss of grassland, no net loss of curlew, or no net loss of lapwing. However, we have shown
325 that the underlying species distributions, layered with the agricultural and development rental values
326 of parcels, result in very different landscape outcomes depending on the metric chosen. What these
327 results show is that if the policymaker is aiming for the metric to act as an indicator to mitigate
328 impacts on a range of closely related habitats and species, then a simple no net loss target is not
329 adequate. Our reason for exploring a single policy outcome in this paper was the simplicity in the
330 trading rules by allowing us to trade like for like. That is, the more complex the units of exchange, the
331 more difficult it is to establish a market where trades take place. What we show, however, is that if
332 policymakers wish to secure multiple outcomes from an offset policy, then these must be established

333 within the policy target. Choosing to focus on a single indicator species will not deliver multiple
334 target outcomes for biodiversity (Armsworth et al 2012). The simpler (theoretical) solution to this is
335 to specify these multiple outcomes within the policy, i.e., no net loss of grassland *and* no net loss of
336 lapwing. However, with the focus on biodiversity offsetting moving towards securing ecosystem
337 service benefits such as recreation and reduced flood risk, this would require a highly complex policy
338 prescription and a much more complex offset metric. Moreover, more complex offset metrics increase
339 the costs of implementing the scheme and are likely to reduce the number of trades and hence the
340 economic efficiency of this policy instrument (Needham et al, 2019).

341 Rather than developing a complex offset credit, an alternative might be to offer a policy fix on either
342 the habitat or species metric. For the habitat metric, the policy fix would focus on increasing the
343 quality of the restored sites in terms of ecological productivity. One way to achieve this would be to
344 differentiate grassland parcels based on the habitat based on quality condition assessments. This
345 approach falls under the broad “Extent x Condition” currencies, with the Australian State of Victoria’s
346 Habitat Hectares approach and the UK Defra Biodiversity Metric 3.0 being examples of this. For the
347 species metric, we would be looking to increase the number of grassland parcels restored across the
348 landscape. To encourage a greater number of offset sites, there could be a limit on the number of
349 species credits a single parcel can sell (stimulating additional parcels to enter the market). This has
350 two advantages. Firstly, it overcomes the problems identified within the ecological-economic
351 modelling framework with the economic model pressing on the fat tail of the predictive ecological
352 modelling. Secondly, by increasing the number of offset sites it reduces large scale clearance and the
353 social impacts associated with large losses in accessible grassland.

354 However, under each of these policy fixes, the impact on the functioning of the offset market itself
355 would need to be taken into account if the ultimate goal is to facilitate offset trading to enable
356 development and conservation priorities to be jointly met. For example, as shown in Simpson et al
357 (2021) increasing a net gain requirement on developers results in fewer landowners choosing to
358 supply offsets, with less land converted to conservation.

359 In conclusion, our modelling shows that there are significant economic and ecological implications
360 following the choice of metric for a biodiversity offset trading scheme. Since these differences in
361 outcomes relate to predictable spatial relationships in observable variables (agricultural profits and
362 development rents), the results have broad implications for biodiversity offset schemes globally. It is
363 clear that, if we wish to secure the most ecologically beneficial design of offsets policy, whether that
364 is based on habitats, species or some other metric, we need to understand the economic decision-
365 making processes of the landowners. We also need to design incentive-based policies that offer the
366 highest incentives for conserving and enhancing the most ecologically beneficial sites in a landscape.

367

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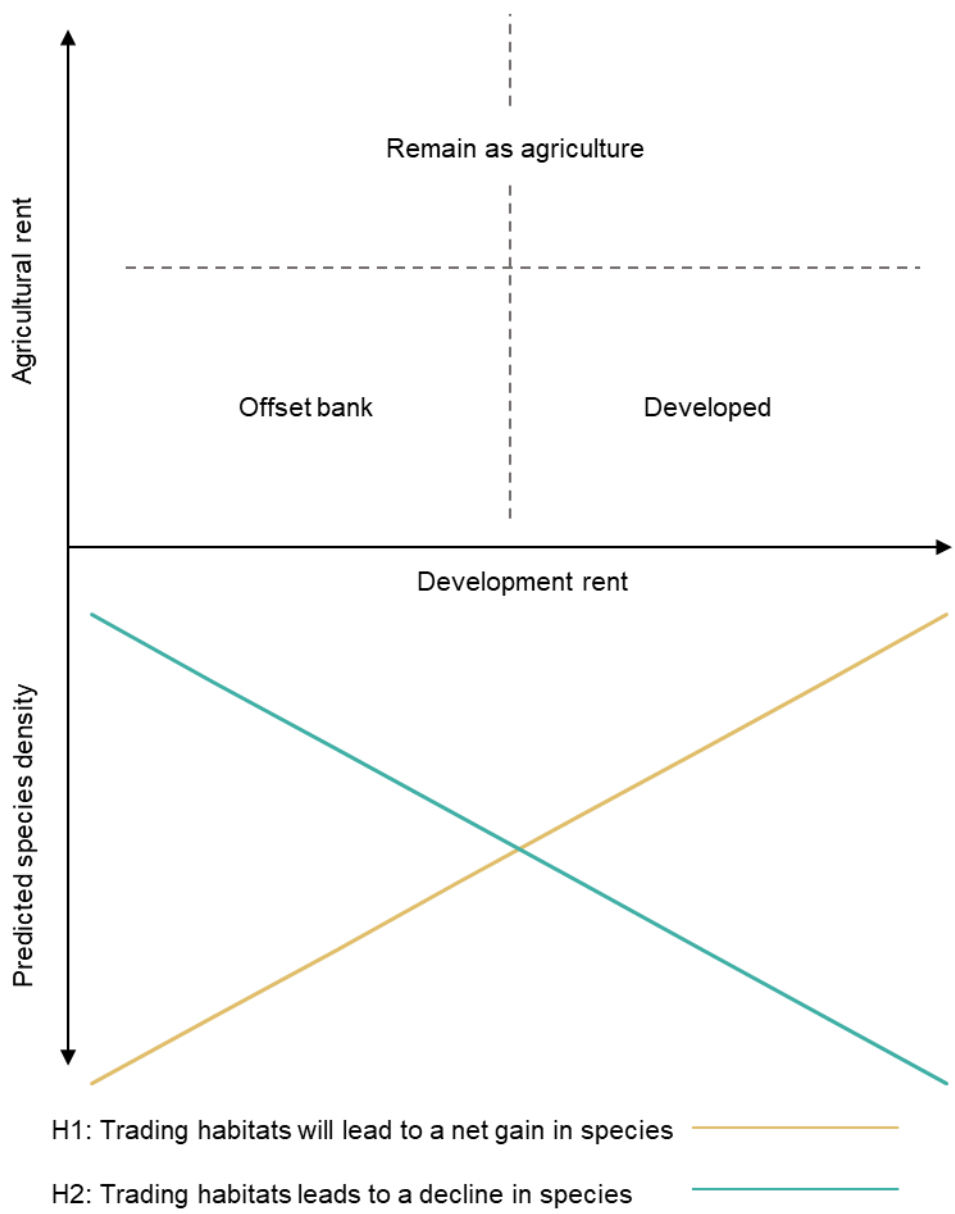
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471 **Table 1: A comparison of offset losses and gains for the original grassland model and the uniformly**
 472 **distributed lapwing and curlew models.**

| | Grassland metric | Lapwing metric | Lapwing scaled uniformly across grassland parcels | Curlew metric | Curlew scaled uniformly across grassland parcels |
|---|------------------|--------------------|---|-----------------------|--|
| Market clear price | £499 (per ha) | £14,127 (per bird) | £13,588 (per bird) | £22,005.38 (per bird) | £19,683 (per bird) |
| Grassland (ha) lost to development | 4,554 | 16,436 | 4,554 | 19,405 | 4,554 |
| Grassland (ha) restored | 4,536 | 169 | 4,608 | 76 | 4,608 |

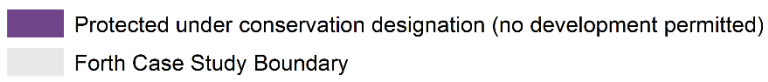
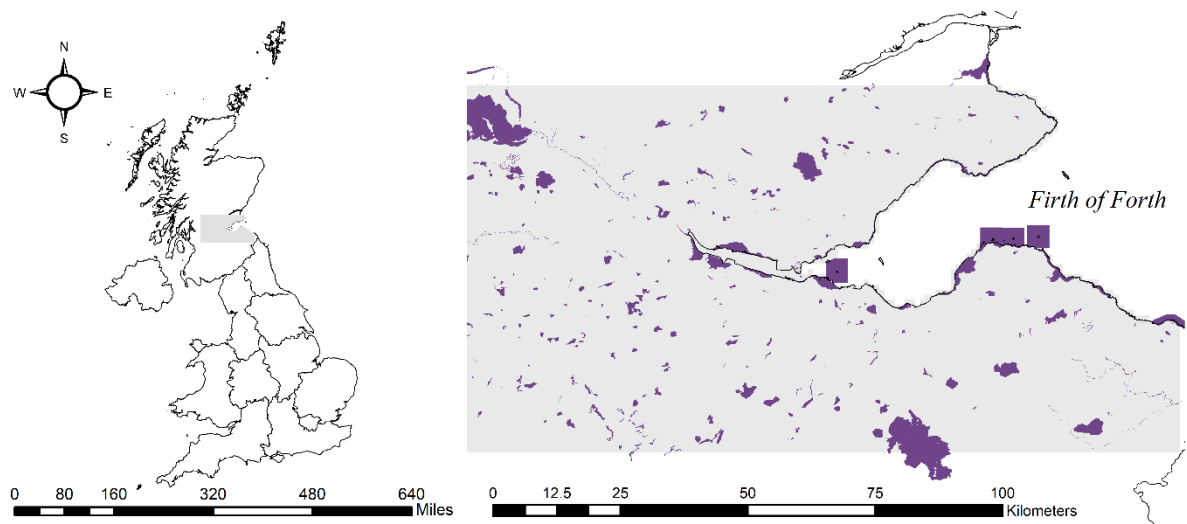
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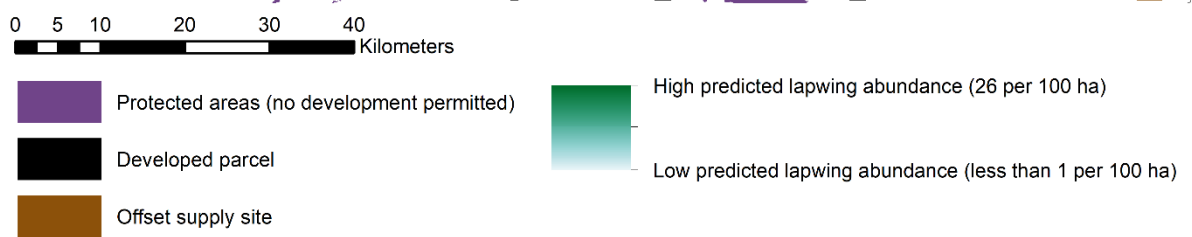
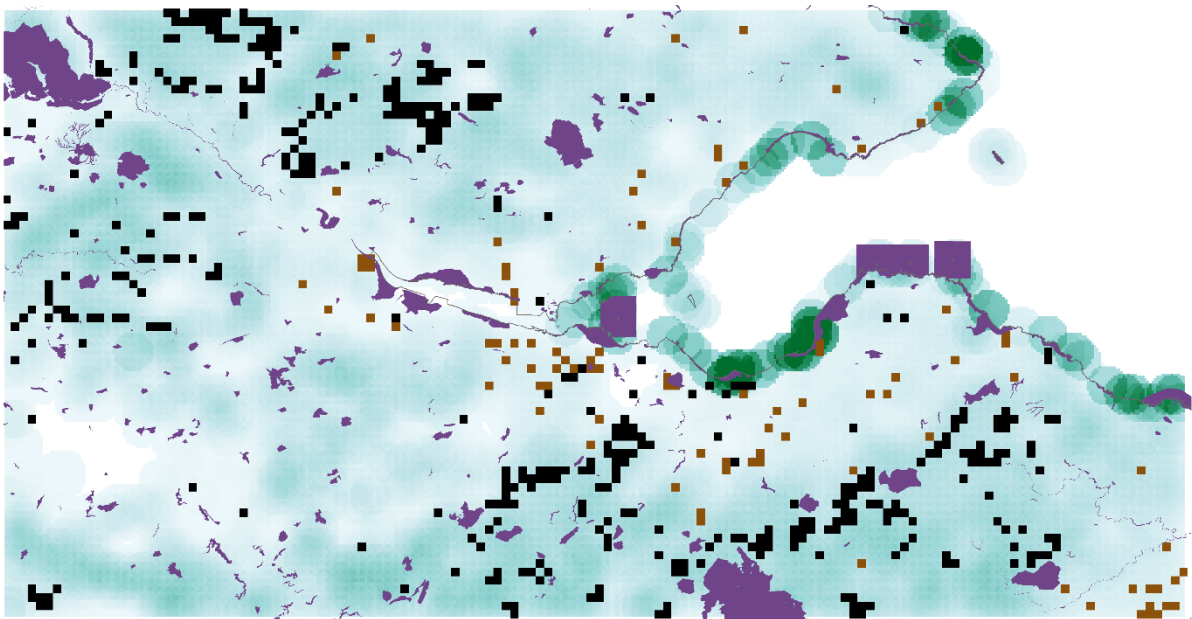
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476 **Figure 1: Schematic of the two alternative hypotheses for the offset market**



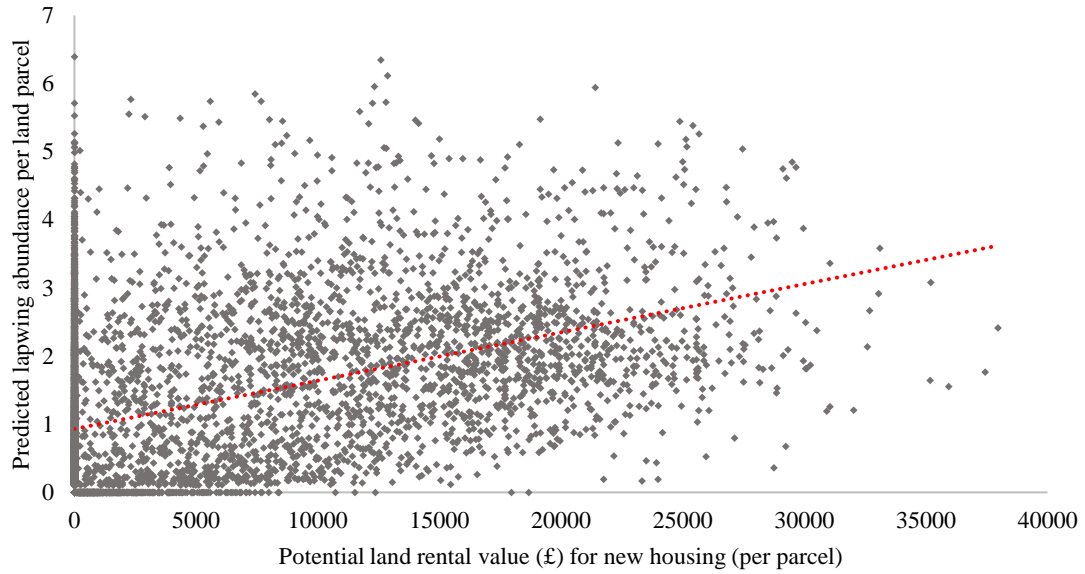
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478 **Figure 2: Overview of the case study region. Protected areas (SSSI, SPA, SAC, NNR and LNR) are**
 479 **protected from future housing developments.**



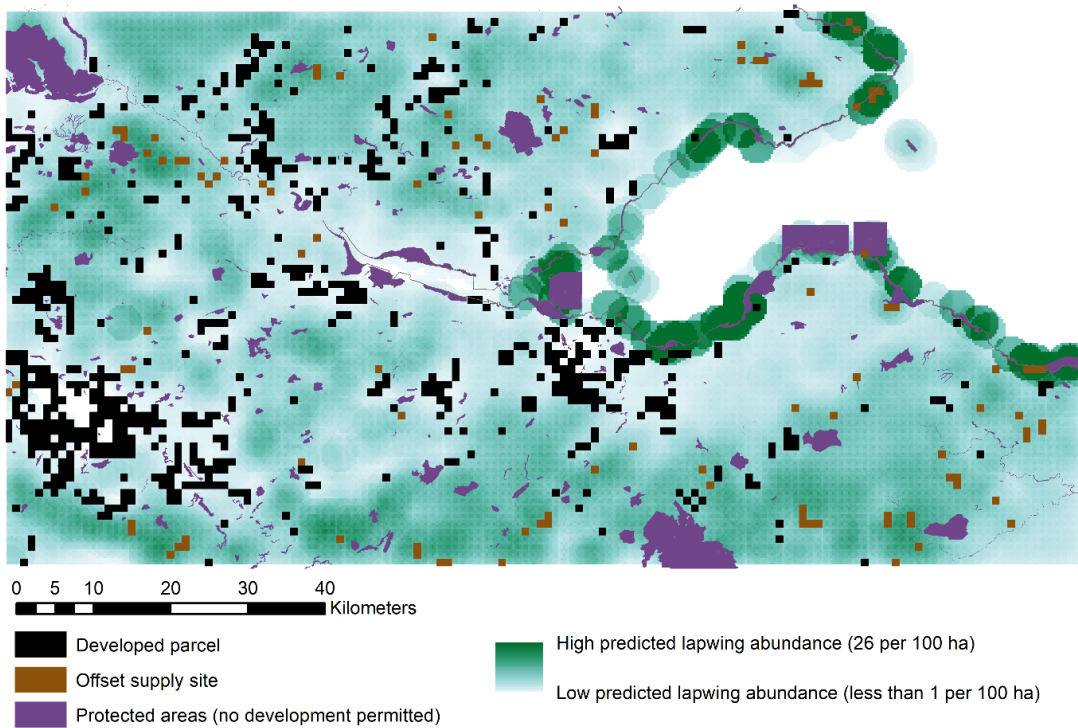
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481 **Figure 3: Landscape-scale outcomes under the grassland habitat metric**



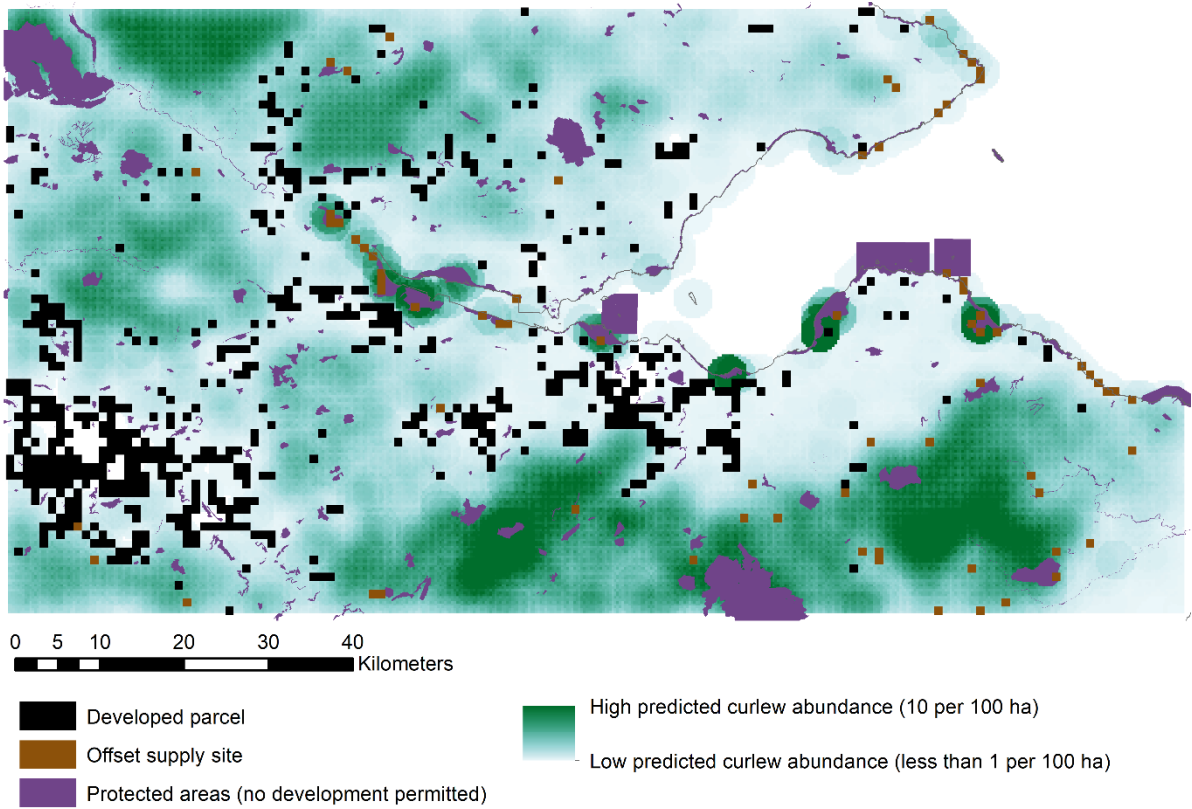
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483 **Figure 4: A comparison of the predicted number of lapwings and the potential land rental value of a**
 484 **parcel for housing ($r=0.08$, $n = 8347$, $p < 0.001$) Note: Only parcels with a positive development value that**
 485 **contain grassland are included in this Figure.**



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487 **Figure 5: Landscape-scale outcomes under the lapwing species metric**



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489 **Figure 6: Landscape-scale outcomes under the curlew species metric**

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