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1 **Common plants as indicators of habitat suitability for rare plants; quantifying**
2 **the strength of the association between threatened plants and their**
3 **neighbours**

4
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19
20 **Abstract**

21 Rare plants are vulnerable to environmental change but easy to over-look during survey. Methods
22 are therefore needed that can provide early warnings of population change and identify potentially
23 suitable vegetation that could support new or previously overlooked populations. We developed an
24 indicator species approach based on quantifying the association between rare plants across their
25 British ecological range and their suite of more common neighbours. We combined quadrat data,
26 targeted on six example species selected from the Botanical Society of Britain and Ireland's
27 Threatened Plant Project (TPP), with representative survey data from across Britain. Bayes Theorem
28 was then used to calculate the probability that the rare species would occur given the presence of an
29 associated species that occurred at least once with the rare species in the TPP quadrats. These
30 values can be interpreted as indicators of habitat conditions rather than expectations of species
31 presence. Probability values for each neighbour species are calculated separately and are therefore
32 unaffected by biased recording of other species. The method can still be applied if only a subset of
33 species are recorded, for example where weaker botanists record a pre-selected subset of more
34 easily identifiable neighbour species. Disadvantages are that the method is constrained by the

1 availability of quadrats currently targeted on rare species and results are influenced by any recording
2 biases associated with existing quadrat data.

3 **Keywords:** biodiversity, Bayes theorem, habitat assessment, global change, conservation

4 **Introduction**

5 Regional species pools are typically characterised by a small number of widespread species and a
6 larger number of rare species (Magurran & Henderson 2003) and the vascular plant flora of Britain is
7 no exception (Rabinowitz *et al.*, 1981). Addressing the conservation of each rare species
8 proportionately and effectively is therefore a major challenge. Britain has the luxury of
9 comparatively excellent data on the occurrence of its rare species, especially plants, but records are
10 often resolved at the grid square (10 x 10km to 100x100m), and not at the habitat-patch scale. While
11 these data support a large number of studies of distributional change and relationships to driving
12 variables (e.g. Henrys *et al.*, 2011; Powney *et al.*, 2014) more detailed habitat patch-scale information
13 is needed to understand the dependence of rare species on particular configurations of abiotic
14 conditions and therefore to highlight potential threats linked to drivers of change in these conditions
15 (Aikens & Roach 2014; Wamelink *et al.*, 2014; Marcer *et al.*, 2013; Huston 1999). A number of
16 approaches to this problem are possible but all are ultimately data constrained (Lomba *et al.*, 2010).
17 Detailed studies of the population dynamics of a plant species can be used to parameterise models
18 of population turnover including dispersal between patches of suitable habitat (Sletvold *et al.*, 2013;
19 Bucharova *et al.*, 2012). However, such studies are costly and the resulting models may often lack
20 the ability to predict how population growth rates respond to interacting global change drivers
21 (Crone *et al.*, 2011). A simpler approach, and therefore applicable to more species, is to attempt to
22 characterise the realised niche by jointly recording abiotic data and occupancy from patches across a
23 species' geographic range, preferably including unoccupied patches beyond the range margin so as
24 to ensure that climatic constraints can also be identified (Henrys *et al.*, in press; Wamelink *et al.*,
25 2003; Rowe *et al.*, 2015). This method depends on adequate coverage of a species' realised niche,
26 which is often not feasible because of the scarcity of fine-scale data that sample the entirety of each
27 rare species' biogeographic range (Gogol-Prokurat 2011). Niche models can be constructed based on
28 very few recorded presences but the resulting niche description is quite likely to be ecologically
29 incomplete. Moreover it may only be possible to build models if the few presences are coupled with
30 a much larger number of absences. This can result in spuriously impressive model performance
31 unless models are evaluated against independent test data (Lobo *et al.*, 2008; Bahn & McGill 2013;
32 Randin & Dirnbock 2006).

33 We present an example of an approach based on identifying the more frequent associates that tend
34 to grow alongside the rare plant. These faithful neighbours can then be used to infer the suitability
35 of habitat conditions for the rarer species without necessarily measuring these associated
36 conditions. The method is easily repeated and the indicator list updated as more quadrats are
37 recorded that sample more of the rare species' range. This method also circumvents the need to
38 make arbitrary decisions about the number and ecological range of absence data assumed to
39 represent unfavourable niche space (Fig 1). Thus we define a list of neighbours as any species that
40 grows alongside the rare species. Absence data is then defined as all locations where any one of the
41 neighbour species has been recorded but in the absence of the rare species (Fig. 1). Our reasoning is
42 as follows: Consider a rare species that is obligately dependent on another more common species

1 but not the other way around; if the rare species is present then the more common species must be
2 present. However, if the rare species is not recorded then the reliability of the common species as an
3 indicator of appropriate conditions for the rarity is lessened the more that the common species
4 grows under a wider range of conditions than those associated with the rarity. We recognise that it
5 is not just abiotic factors that are responsible for influencing rare plant population size. Variation in
6 demography (Freckleton & Watkinson 2002; Yenni *et al.*, 2012), reproductive biology (Pocock *et al.*,
7 2006; Kunin & Gaston 1997), phylogeography and dispersal (Pigott & Walters 1954; Kimberley *et al.*,
8 in press) and negative and positive interactions with other species including mycoheterotrophy
9 (Jarvis *et al.* 2015; Selosse *et al.*, 2006) can explain why some species are restricted in their
10 geographic range, habitat specificity and local population size (Rabinowitz *et al.* 1981). We proceed
11 on the assumption that particular configurations of abiotic conditions are at least a critical pre-
12 requisite for rare species persistence (e.g. Wamelink *et al.*, 2014) and that identifying faithful
13 neighbours is a useful tool to help rapidly compare potentially suitable vegetation patches. In
14 recognition of the fact that additional factors may be required to more fully explain a particular
15 species' abundance we emphasise that the faithfulness of neighbour species is interpreted as
16 indicating varying habitat suitability rather than varying probability of presence.

17 This faithful neighbour approach seeks to identify indicator species on a continuum where the best
18 indicator always grows with the rare species, and never elsewhere. However, such an optimal
19 indicator would also, by definition, be as rare as the rare species of interest in the habitats sampled
20 although it could still be more detectable because its populations were always larger. At the other
21 extreme, a plant species may always have been recorded accompanying the rare species, but if it
22 occurs very widely elsewhere its presence is not likely to be a good discriminator of suitable
23 conditions for the rare species. For any rare species, we would expect to identify a range of possible
24 indicators that vary in the strength of their association with a rare species. The approach lends itself
25 to the following applications:

- 26 1. Early-warning monitoring of a possible reduction in the suitability of conditions for extant
27 rare plant populations by reference to changes in the presence of neighbouring plant
28 species.
- 29 2. Initial assessment of the suitability of sites for re-introduction of the rare species.
- 30 3. Locating new or pre-existing populations based on identifying floristically appropriate
31 vegetation patches in a wider area of search.

32 Deriving indicator species in this way depends on data availability; datasets are needed that sample
33 the rare species and its neighbours and that represent the wider geographic range and habitat
34 affinities of the neighbours in situations where the rare species is not found. Here, we used
35 extensive GB-wide survey datasets covering the majority of common and rare vegetation types.
36 These data have already been used to develop Species Niche Models for a large proportion of British
37 vascular plants and bryophytes (De Vries *et al.*, 2010; Henrys *et al.* in press). Coverage of rare species
38 was based on species-compositional data from the Threatened Plant Project (TPP) organised by the
39 Botanical Society of Britain and Ireland (BSBI).

40 The TPP was a five-year survey to assess the status of 50 of Britain and Ireland's most threatened
41 plants using a standardised and repeatable methodology. Species were chosen from a broad
42 spectrum of ecological conditions but with a bias towards infertile, semi-natural habitats in the

1 lowlands. Species also differed in terms of their distributional range, but were similar in having
2 suffered recent declines. Data were collected to provide an assessment of recent trends, including
3 drivers of change, and to quantify the ecological and management requirements of these rare and
4 threatened species. The aim was to aid targeting of conservation management, refine national
5 'threat' status and provide a baseline from which future population changes could be assessed. For
6 each species a sample of populations was drawn at random from high-resolution records collected
7 since 1970. The sample was stratified by vice-county (subdivisions of land area used to organize
8 recording of the flora of the UK) with number of locations proportional to the number of records per
9 vice-county. These locations were revisited between 2008 and 2012. Plant species growing with the
10 threatened focal plant were also identified by recording the species composition of 2m diameter
11 circular quadrats co-located with the rare species population. These data were used in combination
12 with the GB-wide survey data to quantify the extent to which other more common plant species
13 tended to grow with the rare species, and therefore to identify possible indicators of suitable habitat
14 for the rare species. The strength of the association was quantified by the probability that the rare
15 species will be present given the presence of the more common associate. This probability was
16 calculated for every plant species recorded growing with each of the TPP rare species. Here we
17 present the results of this analysis for six of the TPP species namely *Astragalus danicus*, *Blysmus*
18 *compressus*, *Gentianella campestris*, *Oenanthe fistulosa*, *Polystichum lonchitis* and *Vicia orobus*.
19 These species were chosen to represent a range of habitats across Britain and because their
20 ecological requirements were well known to the authors such that the results could be readily
21 assessed for their plausibility. Nomenclature follows Stace (2010) for vascular plants and Hill *et al.*,
22 (2008) for bryophytes.

23 **Methods**

24 *Study species*

25 *Astragalus danicus* is a low-growing perennial of dry, infertile grassland where competition from
26 other species is low. It grows best at low altitudes in short calcareous grassland in the eastern and
27 south-eastern England. In northern England, Scotland and the Isle of Man it occurs in grassland
28 associated with base-rich rock outcrops, cliff-tops and sand dunes. Populations on the Aran Islands in
29 Western Ireland occur on deposits over limestone pavement. It appears to have declined
30 substantially in southern and northern England, largely due to agricultural improvement or lack of
31 grazing. Less is known about populations in Scotland and Ireland which are presumably stable.

32 *Blysmus compressus* is a rhizomatous perennial of open mire, marsh and fen vegetation, dune slacks
33 and in damp grassland, often by flushes, springs and riversides. The species is widespread but
34 localised across England, rare in Scotland and Wales and not recorded from Ireland. It has been
35 assessed as Vulnerable in Great Britain due to substantial declines attributed to changes to
36 hydrology, loss of habitat, nutrient enrichment and reduced grazing levels.

37 *Gentianella campestris* is a short biennial that grows in mildly acid to neutral, low fertility soils, and
38 is most often found in open, grazed, species-rich pastures, maritime heath, dune slacks and machair
39 where competition from other species is low. It is widespread but localised throughout Scotland,
40 north Wales, north and west Ireland and northern England, but is very rare in England south of the
41 Pennines. Substantial losses are recorded from across its range over the last 50 years, leading to an
42 assessment of Vulnerable in GB and Endangered in England and Wales.

1 *Oenanthe fistulosa* is an umbellifer of damp, seasonally inundated weakly acid to weakly basic soils.
2 Plants persist in lightly shaded conditions but are weak competitors. Ideal conditions for *O. fistulosa*
3 comprise areas of bare damp soil for germination and a grazing or cutting regime to create open
4 areas and restrict the growth of more vigorous wetland species. Widespread but declining across
5 much of southern England, Ireland and coastal regions of Wales, it is a rare species in Scotland and is
6 assessed as Vulnerable in GB.

7 *Polystichum lonchitis* is a montane fern confined to rock outcrops, screes and limestone pavements
8 in upland regions of England, Wales, Scotland and Ireland. It is a very slow growing species that is
9 susceptible to grazing, burning, and collecting. British and Irish populations are at the southern edge
10 of its range and therefore may also suffer as a result of climate change.

11 *Vicia orobus* is a tall, perennial member of the pea family found on sloping, free-draining neutral to
12 mildly-acid soils across a range of habitats, including low fertility pastures and hay meadows, mires,
13 stream banks, ravines, sea cliffs, limestone heath and woodland margins. The bulk of the GB
14 population is found in Wales. Elsewhere, it is thinly scattered throughout the southern uplands and
15 along the west and north coast of Scotland, and is rare in Ireland and England. *Vicia orobus* is
16 assessed as Near Threatened in GB and Vulnerable in England, but is of Least Concern In Wales.

17 *Datasets*

18 TPP quadrat data was provided by the BSBI (Table 1a). In addition, datasets were required covering
19 British vegetation as a whole, and from which quadrat data could be extracted representing the
20 ecological range of each of the neighbour species recorded at least once with each of the six species
21 in the TPP quadrat data (Table 1b). Quadrats from both datasets were combined to form one subset
22 of data per TPP species for analysis. In the TPP subset every quadrat contained the rare species while
23 the contextual data was defined by the fact that every plot contained at least one of the neighbour
24 species found growing at least once with the TPP species in the TPP dataset.

25 *Quantifying the association of rare species with their neighbours*

26 We combined the contextual GB data and the TPP data to define the probability (P) that a rare (r)
27 species will be present given the presence of a neighbour (n) species as follows;

$$28 \quad P(r|n) = \frac{P(n|r) * P(r)}{29 \quad (P(n|r) * P(r)) + (P(n|r') * P(r'))}$$

30

31 This is a simple application of Bayes Theorem (Webb & Westover 1997). The data required for this
32 equation are as follows:

- 33 $n \cap r$ the number of plots containing the rare species and the neighbour,
34 $n \cap r'$ the number of plots containing the neighbour but not the rare species,
35 $r \cap n'$ the number of plots containing the rare species but not the neighbour.

36 To illustrate the calculation required we set $n \cap r = 60$, $n \cap r' = 900$ and $r \cap n' = 40$, giving:

1

$$P(r|n) = \frac{(60/100) * (100/1000)}{(60/100) * (100/1000) + (900/900) * (900/1000)}$$

4

$$P(r|n) = 0.0625$$

6

7 The key piece of information required in the numerator is the prior knowledge about the prevalence
8 of the rare species in the total dataset of TPP plots plus plots in which the neighbour species occurs,
9 $P(r)$. This probability is used to weight the probability that the neighbour species will be present
10 given the rare species is present. Even if a neighbour species is very common the proportion of the
11 total number of plots occupied by the neighbour and the rare species will be lower with increasing
12 rarity of the rare species. The denominator equals $P(n)$ and ensures that $P(r|n)$ ranges between 0
13 and 1.

14 The probability of the neighbour occurring in plots where the rare species is absent, $P(n|r')$, is
15 always 1 because all plots selected from the contextual datasets must have the neighbour present.
16 This reflects our strategy for excluding plots where *both* rare species and neighbour are absent.
17 These plots are uninformative because their joint absence provides no reliable information about
18 the probability of the rare species occurring. With greater sampling of the rare species' range
19 additional data may be justified for inclusion as additional neighbours are discovered accompanying
20 the rare species. The other extreme would be to analyse the association between the neighbour and
21 the rare species but only within plots where the rare species was present. This would ignore the
22 many occurrences of the neighbour where the rare species was absent and thus overestimate the
23 faithfulness of the neighbour.

24 *Data assembly and analysis*

25 For each of the six species, a list of neighbours was defined as any species that occurred in any of the
26 TPP quadrat data for each species. To define the wider prevalence of the neighbours in the absence
27 of the rare species we assembled quadrats from the datasets outlined in Table 1b where each
28 neighbour occurred. This process yielded varying numbers of additional quadrats in which the rare
29 species also occurred. These plots were added to the rare species dataset. Any species growing with
30 the rarity in this dataset not already present in the TPP plots were also added to the list of
31 neighbours.

32 Probabilities for each neighbour species (i.e. $P(r|n)$) were calculated in a SAS script (SAS Institute
33 1999). Mean probabilities were then calculated by natural log transforming and then averaging the
34 probabilities across all neighbours occurring in each quadrat. Thus we calculated the geometric
35 mean and thereby reduce the influence of any extreme values. This was done for the TPP plots and
36 the wider GB survey plots in which the neighbour species occurred without the TPP species. The
37 distribution of mean values for the TPP plots provides a reference distribution indicating the range of
38 values likely in quadrats where the rarity occurs. The mean and range of probability values for the
39 plots containing neighbours but without the rare species ought to be lower. Overlap indicates

1 groups of TPP plots which could be considered sub-optimal or unoccupied patches elsewhere in GB
2 that may provide favourable habitat for the rare species at least on the basis of the other species
3 present.

4

5 **Results**

6 The mean number of neighbour species per TPP quadrat ranged from 53 for *Polystichum lonchitis* to
7 17 for *Astragalus danicus* (Table 2). The total number of neighbour species that were recorded at
8 least once in quadrats with the rare species present ranged from 181 for *Vicia orobus* to 329 for
9 *Gentianella campestris* but this difference in list length partly reflects differences in total number of
10 quadrats recorded between TPP species (see Supplementary Material). Each of the TPP species was
11 associated with a small number of neighbours that had probability values of 1, indicating that if the
12 neighbour species is found then the TPP species will always be present (Fig. 2, Table 3). These
13 probability values arise when the neighbour is present only in the TPP quadrats. Most reflect
14 recording biases between the survey datasets. For example the critical *Euphrasia* taxa associated
15 with *G. campestris* and *Blysmus compressus* were not differentiated in the wider contextual
16 datasets. A small number of bryophyte species were also recorded in TPP quadrats and were either
17 absent or under-recorded in the contextual data. For example, in the Countryside Survey only a
18 limited range of common bryophytes are ever recorded.

19 Species with Bayes probability values less than 1 displayed very similar shaped distributions for each
20 of the six TPP species. The majority of neighbour species had very low values, these being
21 widespread plants found extensively in the absence of the TPP (Fig. 2). Those that occurred at least
22 once with a TPP species but had the weakest associations were *Holcus lanatus*, *Agrostis capillaris*, *A.*
23 *stolonifera*, *Poa trivialis*, *Lolium perenne*, *Galium saxatile*, *Calluna vulgaris*, *Trifolium repens* and
24 *Nardus stricta*. A number of species had higher values thus exhibiting stronger associations with the
25 TPP species (Fig. 2; Table 3). Many such species were very infrequent in the TPP data consistent with
26 their extreme rarity in Britain. Hence their relatively high probabilities resulted from the fact that
27 they were also very infrequent in the wider contextual datasets. For *A. danicus* these included
28 *Dianthus deltoides*, *Neotinea ustulata* and *Orchis anthropophora*, all of which are very localised
29 species of dry, infertile grasslands (Table 3). The strong but infrequent indicators for *G. campestris*
30 reflected its relative abundance in very infertile swards in the north and west of the British Isles
31 (*Gnaphalium sylvaticum*, *Meum athamanticum*, *Ophioglossum azoricum*) whereas for *Oenanthe*
32 *fistulosa* its strongest neighbours were drawn from highly localised marsh and semi-aquatic
33 assemblages (*Cicuta virosa*, *Hydrochoris morsus-ranae*, *Liparis loeselii*, *Sium latifolium*) (Table 3). The
34 strong indicators for *Polystichum lonchitis* were by far the rarest reflecting the highly specialised and
35 localised nature of its montane habitats (*Carex atrata*, *Draba norvegica*, *Dryopteris expansa*,
36 *Saxifraga nivalis*, *Veronica fruticans*, *Woodsia ilvensis*). The relatively few strong indicators for *B.*
37 *compressus* and *Vicia orobus* reflected the wide variety of habitats in which they were both recorded
38 across both the TPP and contextual data (Table 3).

39

40 **Discussion**

1 *Species diversity patterns and variation in numbers of neighbours*

2 The total number of neighbour species differed between each TPP taxon. Three factors are
3 important in shaping these differences. Sampling bias could interact with differences in the species
4 richness of sampled plots (α -diversity) and species compositional turnover between plots (β -
5 diversity) to influence the length of the list of neighbours. It is possible that the identification of
6 neighbours was influenced by bias in the sampling procedure. However, this is more likely to have
7 resulted from biased quadrat locations within each population location rather than biased selection
8 of habitats. Sites containing populations of each species were randomly drawn in proportion to the
9 number of known historical locations across vice-counties. Eligible locations were therefore
10 distributed throughout the biogeographic range of each species and should unbiasedly represent the
11 variation in occupied habitats and ecological conditions. However, within each location, quadrats
12 were positioned to be representative of the rare species and its vegetation context rather than being
13 strictly randomly placed. It is therefore possible that deliberate bias toward the rare species on each
14 TPP site could increase the probability that any one neighbour occurs with the rare species. Yet this
15 is precisely why we apply Bayes Theorem since this downweights the probability of the neighbour
16 occurring given the presence of the rarity by the prevalence of the rare species in the wider UK
17 dataset. The same could also be said for rare neighbours; targeting the rare TPP focal species could
18 also have inflated the richness of rare species that are neighbours if rare species tend to grow
19 together (Pilgrim *et al.*, 2004). However rare species do not always occur together to produce
20 hotspots of high rare species richness (Heegaard *et al.*, 2013). Moreover, the average Bayes P values
21 for the TPP plots are a function of all neighbour species, both common and rare. Hence the very high
22 rare species probability values for the rarest species that grow with the TPP focal plant do not
23 generally lead to very high average Bayes P values for TPP plots because these species are very rare
24 in both the TPP and contextual data (Table 3).

25 Differences in the number and identity of neighbours will have also been influenced by variation in
26 species composition between habitats and species richness within plots. Species compositional
27 turnover will be greatest where the range of habitats and conditions varies across the species range
28 and where the occupied habitats are typically species-rich. Turnover will be lower where the
29 geographic range is smaller, where the same kind of habitat is occupied throughout the species
30 range and where conditions limit the species richness of habitat patches. For example, relatively
31 lower α -diversity could result from filtering for a small number of specialists such as salt-tolerant,
32 shade-tolerant or montane taxa, or from the suppressive effect of a small number of dominants that
33 thrive in the modern countryside (Pilgrim *et al.*, 2004; Smart *et al.*, 2006a). Given the trait profile of
34 the declining plant species in Britain and NW Europe - typically short, stress-tolerant forbs at a
35 competitive disadvantage under high nutrient supply and when competing for light - the former
36 scenario would seem more likely to apply to vegetation with low α -diversity but containing rare
37 species (see for example Lauterbach *et al.*, 2013; Powney *et al.*, 2014; Walker & Preston 2006; Tamis
38 *et al.*, 2005; Braithwaite *et al.*, 2006; Smart *et al.*, 2006b; Sundberg 2014). In fact α -diversity varied
39 considerably across each species dataset (Table 2). When differences in the total number of TPP plots
40 were taken into account, the count of neighbours was relatively low for *Vicia orobus* whereas
41 *Polystichum lonchitis* had a somewhat longer list of neighbours than expected given the number of
42 TPP plots recorded. To help assess the contribution of within-plot species richness versus turnover
43 between plots, we calculated β -diversity as the total number of associates divided by mean species
44 richness (Anderson *et al.*, 2011). This metric takes into account species richness in plots to give the

1 number of different species that need on average to be present in each plot to yield the total pool of
2 neighbours recorded across all plots. It is, therefore, an estimator of average turnover in species
3 composition between plots.

4 The greatest β -diversity was attributable to *Astragalus danicus* (Table 2). In the TPP surveys, this
5 species was found in a wide range of habitats from sea level to 710m, in coastal heath, dune
6 grassland, neutral grassland, road verges and calcareous grassland, the common denominator being
7 short vegetation height, typically <10cm, and either level-or south-facing slopes (Walker 2011). The
8 lowest β -diversity was associated with *Polystichum lonchitis*, reflecting its confinement to a much
9 narrower range of conditions; typically calcareous high altitude rock outcrops, screes and limestone
10 pavement, but where species richness within plots was the greatest of the six species studied (Table
11 2).

12 *Applying neighbour species to newly recorded vegetation*

13 Our method for deriving indicator species has advantages and disadvantages. We calculated the
14 probability of a rare species being present given the presence of another neighbour species, but did
15 not account for further multi-species associations for example where rare species A has a greater or
16 lesser probability of occurring if neighbour X is also joined by neighbour Y. Thus the disadvantage of
17 this strictly individualistic approach is that it does not explicitly include multiple inter-specific
18 associations of the kind that would emerge from ordination or community distribution models
19 (Chapman & Purse 2011). Hill (1989) mooted the idea of applying Bayes theorem to the assignment
20 of new species lists to existing probabilistic classifications of plant communities. However, he saw
21 the challenge of including all possible multiple species dependencies as insurmountable. Since we
22 were interested in determining the indicator status of each neighbour species independently of any
23 other, Bayes theorem could still be applied. There are a number of advantages: Since each species-
24 specific Bayes probability value is treated as independent of any other then they are also
25 independent of recording biases in the data. Thus the *Gentianella campestris* Bayes probability value
26 for its neighbour *Spiranthes spiralis* is not influenced by the under-recording of *Euphrasia* taxa in the
27 contextual data. In addition, it would also be possible to apply a pre-selected subset of “easier-to-
28 identify” indicators, for example in a citizen science field campaign such as the new National Plant
29 Monitoring Scheme, where botanical skill varies among volunteers. Not recording the entire species
30 composition of quadrats would weaken the power of the approach, but not invalidate it.

31 Having calculated Bayes probabilities for each neighbour, the database of values can be used to
32 generate reference distributions of mean Bayes probabilities for both (1) the TPP data, in which the
33 rare species was always recorded (less negative values, Fig. 3) and (2) the contextual data,
34 representing the range of every neighbour species but where the TPP species was absent (more
35 negative values, Fig. 3). These distributions allow mean probability values for new quadrat species
36 lists to be evaluated graphically and statistically. Questions might include, how does the mean
37 indicator value for *Astragalus danicus* calculated from new monitoring plots, or from vegetation in
38 which *A. danicus* was recorded previously, compare to the distribution of values for TPP plots in
39 which *A. danicus* was present? Thus, the database of probability values can be applied to new
40 quadrat species lists. There is no need to further discriminate indicators from non-indicators based
41 on the size of the probability value. All the associate species carry information, and all can be
42 applied. If associates with higher probability values are present, this will simply increase the mean

1 value for a new species list. A quadrat from the *Blysmus compressus* TPP dataset was selected to
2 illustrate this approach. The species list was recorded in a 1x3m quadrat centred on a population of
3 c.100 individuals confined to the shorter vegetation at the edge of the verge on the Orton to
4 Appleby road in Cumbria (OS grid reference NY 646 156 (lat 54.534426 long -2.5485796)) (Plates 1 &
5 2). Six species; *Matricaria discoidea*, *Potentilla anserina*, *Puccinellia distans*, *Polygonum aviculare*,
6 *Agrostis stolonifera* and *Poa annua* were recorded with *B. compressus*. The mean of the natural log
7 of the Bayes probabilities for these four species is -4.87. A statistical test of the probability of this
8 value being more negative than a random draw from the population of Bayes values can be carried
9 out using a simple randomisation test where the value is compared with 1000 bootstrapped samples
10 drawn from the reference dataset (Philippi *et al.*, 1998). An R function to perform the test and to
11 plot the observed value against the associated reference distribution for each of the six species (Fig.
12 1S) is available from the corresponding author on request and in Supplementary Material. The test
13 gave a probability value of 0.001 indicating a very small chance of the observed mean being less than
14 a random draw. Therefore, despite being a relatively species-poor quadrat in the context of all
15 *Blysmus*-containing vegetation (mean species richness =24 1m⁻²; Table 2), the suite of neighbours
16 growing with *B. compressus* at this location did not suggest an unfavourable floristic context for the
17 threatened species population. The position of the new assemblage to the right of the reference
18 distribution does however suggest a less typical mix of species yet this is not attributable to the
19 presence of a large number of widespread species. While this simple test is robust to non-normal
20 reference distributions, interpretation still requires caution because the survey datasets used to
21 build the reference distributions cannot be considered totally unbiased samples of the vegetation in
22 which neighbours and rare species occur.

23 A further issue to consider is that species lists from newly surveyed patches of vegetation may
24 contain species that were never recorded in TPP plots (Fig. 1). These could be considered negative
25 indicators, yet there is no obvious way of quantifying their negative association sensibly other than
26 to simply present a count of such species. Labelling these species as negative indicators also assumes
27 that they never occur with the rare species yet their discovery alongside the rarity immediately
28 classes them as neighbours. The most we can say without further trait-based analysis is that species
29 with very low Bayes probability values are not restricted to the conditions associated with the rare
30 plant and so may in fact be indicators of unfavourable conditions.

31 *Modelling changes in rare species by modelling their neighbours*

32 Information about the conditions associated with the rare species can be inferred from their
33 neighbours. Where these are widespread species their traits and abiotic preferences can be easily
34 obtained. For example, associated disturbance regime, degree of habitat specialisation, substrate
35 fertility, wetness and pH can be estimated from existing plant attribute databases (e.g. Hodgson
36 1991; Lewis *et al.*, 2014). However, an emerging possibility involves the use of empirical niche
37 models applied to the neighbour species. An advantage, over and above simple averaging of trait
38 information, is that interactions among environmental predictors are explicitly included and quantify
39 for example how a plant species' response to soil fertility is modified by soil wetness or successional
40 status (Pakeman *et al.*, 2008; Henrys *et al.*, in press). These models can be used to project the impact
41 of environmental change on plant species composition driven by external factors such as climate or
42 along abiotic gradients that can be influenced by management such as vegetation height, pH and
43 ground wetness (Henrys *et al.*, in press). The impact on habitat suitability for the rare species may

1 then be estimated by recalculating mean Bayes probabilities as neighbour species composition
2 undergoes simulated change. As neighbour species composition changes so will the mean Bayes
3 values associated with the rare species thus quantitatively linking changing ecological conditions to
4 the fortunes of rare plant species populations via the modelled responses of neighbouring plants.
5 Linkage between habitat suitability indices for neighbours and those for rare species could be
6 formally realised within a Bayesian Belief Network (Jensen, 1996). Whilst such simulations of the
7 impacts of environmental change are increasingly possible at the habitat patch scale, the application
8 of empirical niche models often relies on the assumption that patterns in space can usefully
9 substitute for changes in time. This becomes questionable the more that projections are based on
10 novel configurations of environmental conditions (Thuiller *et al.*, 2008; Williams & Jackson 2007).

11 *Further applications*

12 Application of the neighbour-species method is ultimately data constrained. Indeed the examples
13 presented here have only become possible with the availability of the TPP survey data. Even so, both
14 temporal and spatial biases are inherent in the wider survey data and in the extent to which rare
15 species' niche space is accurately represented in the rare species data. We suggest that the best way
16 to understand and minimise the impacts of these sources of variation is to apply the method
17 dynamically so that neighbour lists and their Bayes probabilities are allowed to change and
18 potentially stabilise as more data is collected. Because the calculations are so simple, new rare
19 species survey data uploaded to an on-line repository could be routinely and rapidly processed to
20 update the list of neighbours and associated Bayes probability values and the range of conditions
21 associated with each new rare species population or extirpated population. The uptake of the TPP by
22 volunteer plant recorders suggests that this could be a popular initiative within the biological
23 recording community.

24

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30 non-government bodies including the Department of the Environment, Food and Rural Affairs, the
31 Natural Environment Research Council. Natural England, Scottish Natural Heritage, Natural
32 Resources Wales, Forestry Commission, Joint Nature Conservation Committee and the Woodland
33 Trust.

34

35 **Supplementary material**

36 Fig 1S: Graphical output from the R function that conducts a randomisation test of the probability
37 that the mean $\ln(\text{Bayes probability})$ for neighbour species in a new patch is more negative than a
38 random draw from the reference distribution for any of the six TPP species. The histogram shows
39 the distribution of mean $\ln(\text{Bayes probabilities})$ for the TPP quadrat dataset for *Blasmus compressus*
40 and the position (dashed line) of the example value of -4.87. See text.

- 1 S2_TPP_randomisation_test.txt : An R script to carry out a randomisation test for newly recorded
- 2 vegetation data and to generate the graph shown in Fig 1S.

- 3 S3_All_scores.xlsx: Mean $\ln(\text{Bayes probabilities for each TPP plot})$. Required to carry out the
- 4 randomisation test and generate the reference distribution.

- 5 S4_TPP_neighbour_list.xlsx : List of Bayes probability values and count data for all neighbour
- 6 species.

- 7

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- 1
- 2
- 3

1 **FIGURES & TABLES**

2

3 Table 1a: Survey data pertaining to the six rare species selected from the BSBI Threatened Plant
 4 Project (TPP). See <http://www.bsbi.org.uk/tpp.html> for further details.

Species	Number of locations surveyed	Number of locations where species was found	Number of recorded quadrats containing the rare species
<i>Astragalus danicus</i>	106	75	83
<i>Blysmus compressus</i>	111	88	102
<i>Gentianella campestris</i>	205	149	160
<i>Oenanthe fistulosa</i>	121	82	113
<i>Polystichum lonchitis</i>	54	46	51
<i>Vicia orobus</i>	111	75	96

5

6 Table 1b: Survey data used to represent the wider British ecological range of neighbour species
 7 associated with the six TPP species. All datasets except the NVC were extracted from databases
 8 maintained at the NERC Centre for Ecology & Hydrology (CEH), Lancaster.

9

Dataset	Reference	Date recorded	Geographical scope	Source	Number of quadrats
National Vegetation Classification	Rodwell (1997) et seq.	1965-1980	Great Britain	I.M. Strachan (JNCC)	31266
Countryside Survey 2000	Smart et al. (2003)	1998/1999	Great Britain	CEH	7221
Key Habitats survey	Hornung et al. (1996)	1995	Great Britain	CEH	548
The 'Bunce' Woodland Survey	Kirby et al. (2005)	1971	Great Britain	CEH	1648

10

11

1 Table 2: Summary of species composition and diversity of the TPP quadrats (2m diameter circular
 2 plots).

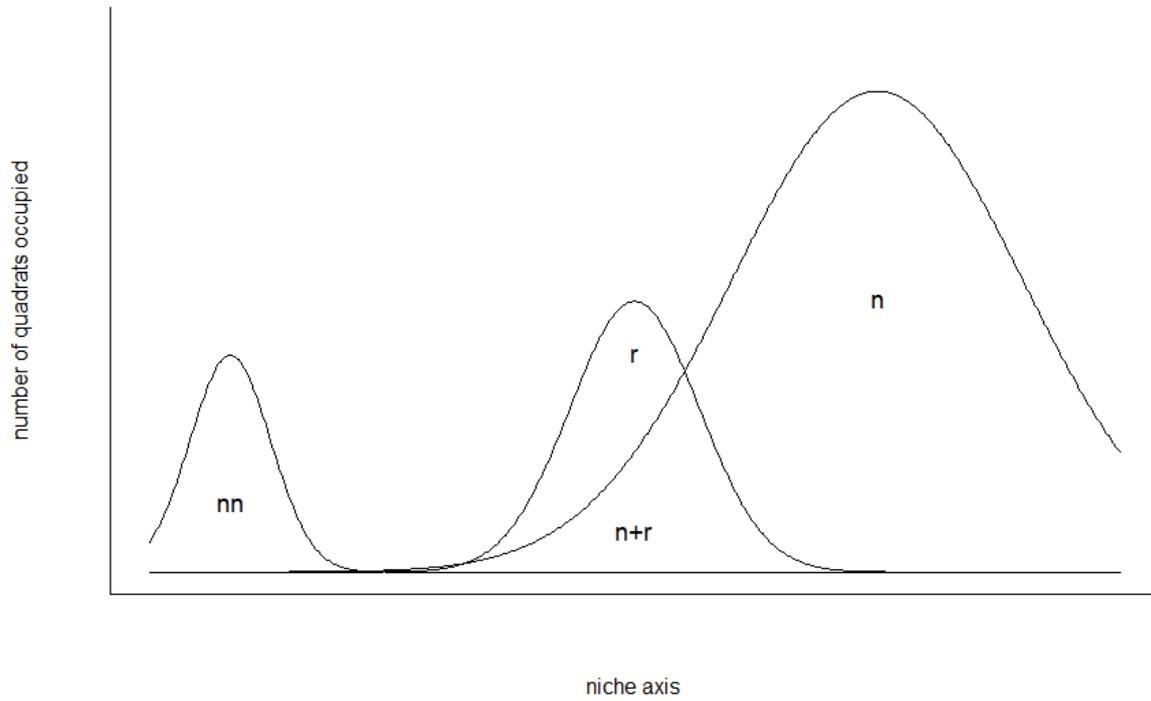
3

TPP species	Count of associated species	Count of associated bryophytes	Mean species richness and range per quadrat	Beta diversity
<i>Astragalus danicus</i>	278	1	17.14 (3-84)	16.22
<i>Blysmus compressus</i>	262	25	24 (4-42)	10.92
<i>Gentianella campestris</i>	329	13	35.12 (4-143)	9.37
<i>Oenanthe fistulosa</i>	301	7	24.54 (1-82)	12.27
<i>Polystichum lonchitis</i>	230	1	53.24 (1-167)	4.32
<i>Vicia orobus</i>	181	4	17.51 (1-36)	10.34

4

5

- 1 Fig 1: Conceptual distributions of species along an arbitrary niche axis. A rare species (r) occupies a
- 2 narrow range of conditions and is less common than a more wide-ranging neighbour species (n) with
- 3 which it coexists ($n+r$) in a part of their joint ecological range. A non-neighbour (nn) species never
- 4 grows with the rare species and so species presence data from this part of the niche axis is excluded
- 5 from the analysis of the association between neighbour (n) and rare species (r).



6

Fig 2: Histograms of Bayes probability values for neighbour species associated with (a) *Astragalus danicus*, (b) *Vicia orobus*, (c) *Blysmus compressus*, (d) *Gentianella campestris*, (e) *Oenanthe fistulosa* and (f) *Polystichum lonchitis*. In each graph probabilities are grouped into 50 equal intervals on the X axis between 0 and 1.

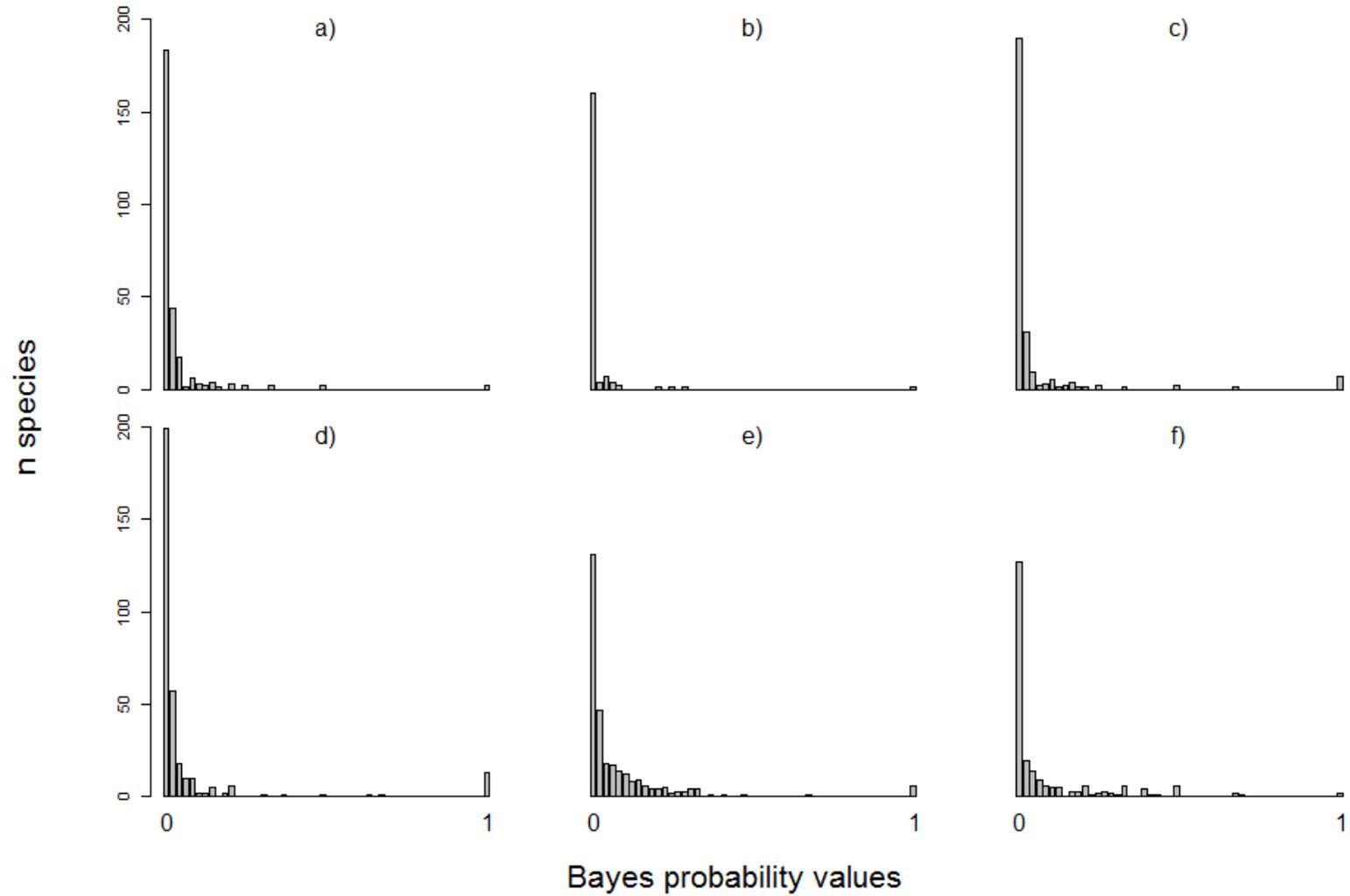


Fig 3: Distributions of mean (\log_e transformed Bayes probability values) for 6 plant species datasets either where the rare TPP species was recorded (Rare present) or where the rare species was absent but where all plots contained at least one record for a neighbour species growing at least once with the rare species in the TPP dataset. (a) *Astragalus danicus*, (b) *Vicia orobus*, (c) *Blasmus compressus*, (d) *Gentianella campestris*, (e) *Oenanthe fistulosa* and (f) *Polystichum lonchitis*.

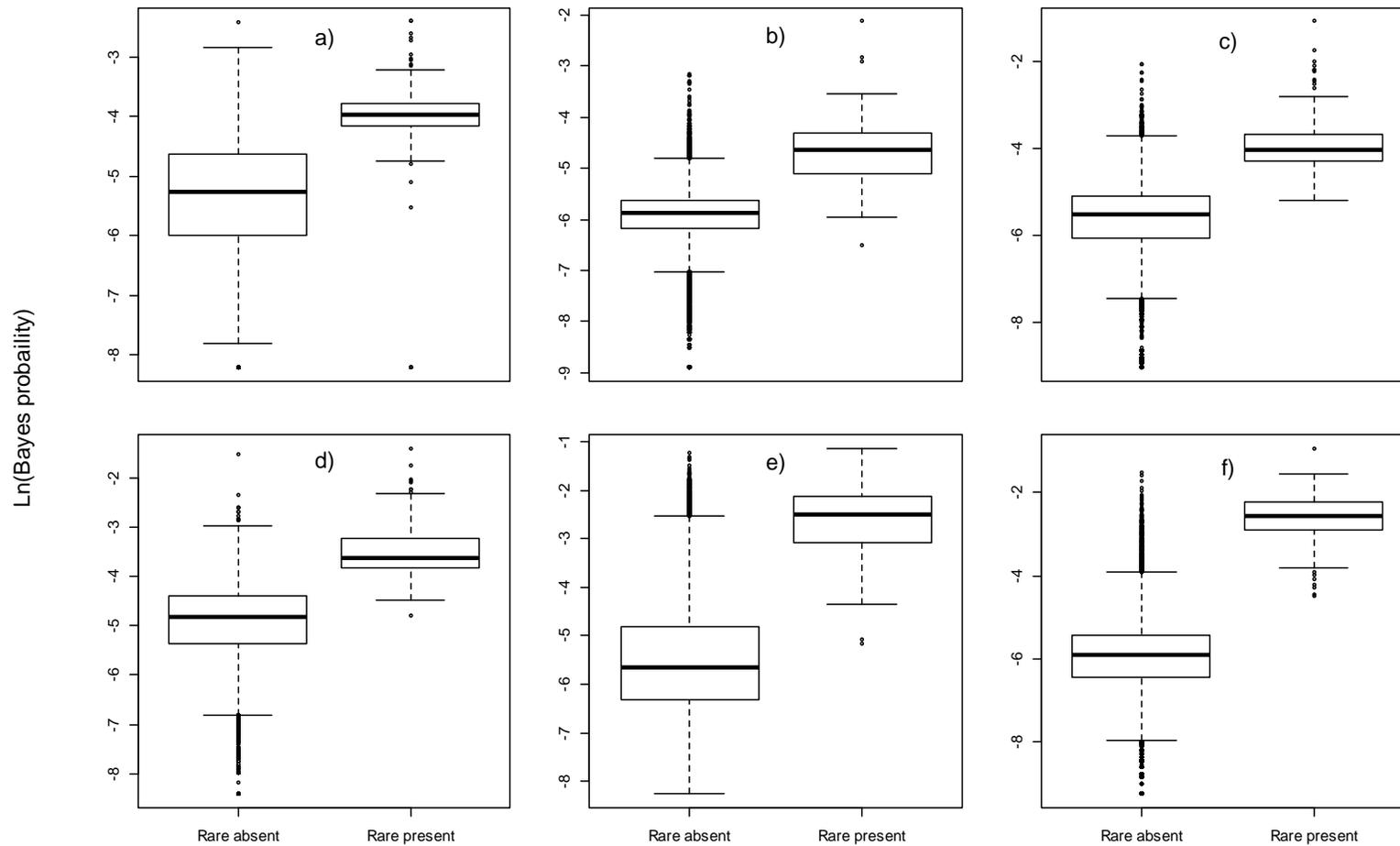


Fig 1S: Graphical output from the R function that conducts a randomisation test of the probability that the mean $\ln(\text{Bayes probability})$ for neighbour species in a new patch is more negative than a random draw from the reference distribution for any of the six TPP species. The histogram shows the distribution of mean $\ln(\text{Bayes probabilities})$ for the TPP quadrat dataset for *Blysmus compressus* and the position (dashed line) of the example value of -4.87. See text.

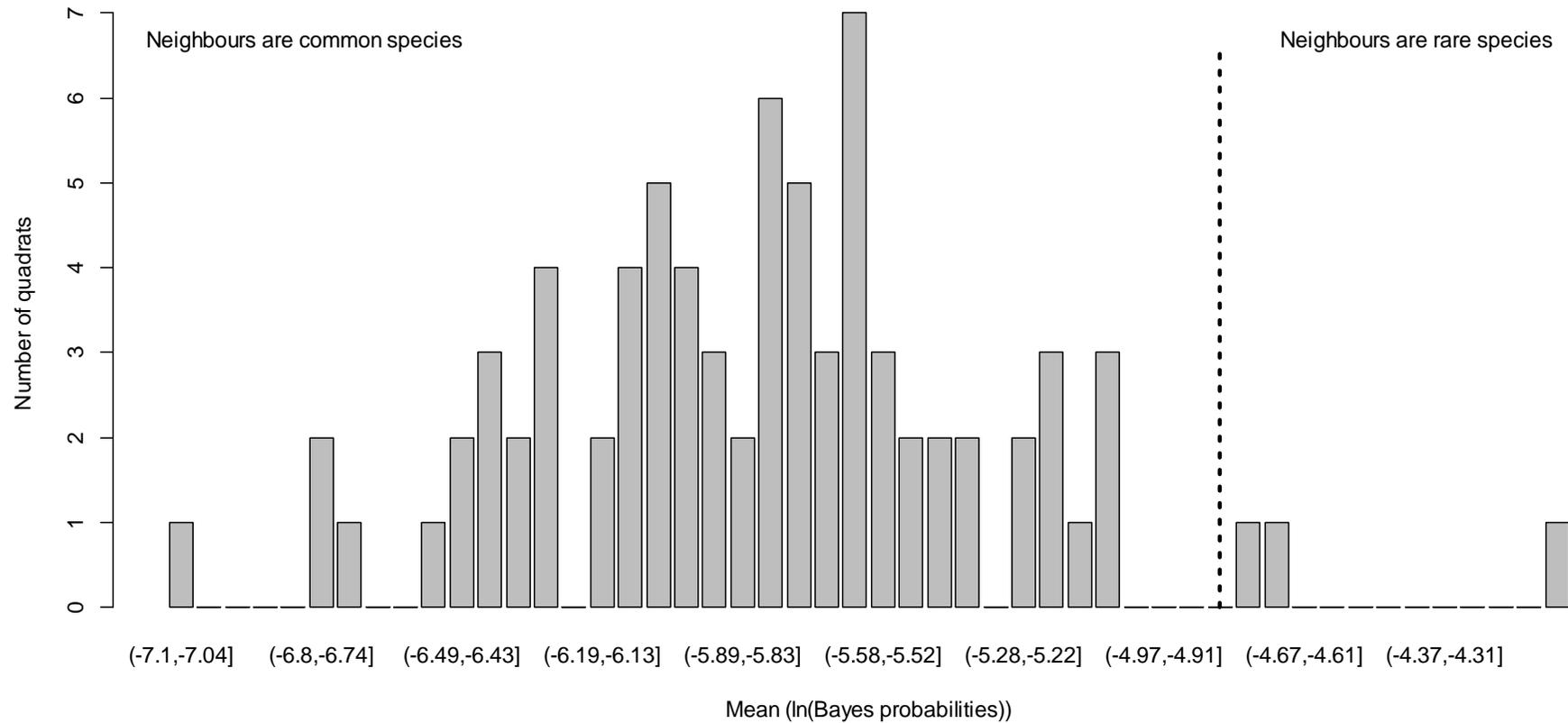


Table 3: Neighbour species for six species surveyed in the BSBI Threatened Plants Project (TPP). Species that only occurred in the TPP quadrat data have a Bayes probability value of 1. For indicator species that also occurred in the absence of the TPP species in wider GB survey data, the top 40 most faithful neighbours are listed. See Supplementary Material for a complete list. Species counts used to calculate the Bayes probabilities are shown in three columns.

TPP species	Indicator species	TPP data Rare present, Neighbour present	TPP data Rare present, Neighbour absent	Contextual data Rare absent, Neighbour present	Bayes_P
<i>Astragalus danicus</i>	<i>Anagallis minima</i>	1	182	0	1.000
	<i>Potentilla tabernaemontani</i>	1	182	1	0.500
	<i>Dianthus deltoides</i>	3	180	3	0.500
	<i>Neotinea ustulata</i>	2	181	4	0.333
	<i>Orchis anthropophora</i>	1	182	2	0.333
	<i>Erophila verna sens.lat.</i>	2	181	6	0.250
	<i>Stellaria pallida</i>	1	182	3	0.250
	<i>Cirsium eriophorum</i>	5	178	20	0.200
	<i>Ophrys insectifera</i>	3	180	12	0.200
	<i>Dactylorhiza purpurella</i>	1	182	4	0.200
	<i>Arenaria serpyllifolia</i>	4	179	19	0.174
	<i>Anacamptis morio</i>	3	180	16	0.158
	<i>Ophrys apifera</i>	4	179	22	0.154
	<i>Carex ericetorum</i>	2	181	12	0.143
	<i>Filago vulgaris</i>	1	182	6	0.143
	<i>Alchemilla filicaulis</i>	1	182	7	0.125
	<i>Pulsatilla vulgaris</i>	12	171	85	0.124
	<i>Saxifraga granulata</i>	4	179	32	0.111
	<i>Rubus caesius</i>	1	182	8	0.111
	<i>Anacamptis pyramidalis</i>	4	179	33	0.108
	<i>Cerastium arvense</i>	5	178	46	0.098

	<i>Thesium humifusum</i>	5	178	47	0.096
	<i>Arabis hirsuta</i>	5	178	51	0.089
	<i>Echium vulgare</i>	6	177	63	0.087
	<i>Viola odorata</i>	7	176	77	0.083
	<i>Poa humilis</i>	3	180	34	0.081
	<i>Descurainia sophia</i>	1	182	15	0.063
	<i>Claytonia perfoliata</i>	1	182	16	0.059
	<i>Viola canina</i>	15	168	243	0.058
	<i>Genista tinctoria</i>	3	180	49	0.058
	<i>Reseda lutea</i>	3	180	49	0.058
	<i>Sherardia arvensis</i>	3	180	49	0.058
	<i>Rosa spinosissima</i>	7	176	116	0.057
	<i>Geranium sanguineum</i>	9	174	151	0.056
	<i>Coeloglossum viride</i>	5	178	85	0.056
	<i>Juncus balticus</i>	1	182	18	0.053
	<i>Tragopogon pratensis</i>	6	177	110	0.052
	<i>Carlina vulgaris</i>	17	166	353	0.046
	<i>Vulpia bromoides</i>	3	180	64	0.045
	<i>Knautia arvensis</i>	5	178	107	0.045
	<i>Tephrosieris integrifolia</i> subsp. <i>integrifolia</i>	2	181	44	0.043
<hr/>					
<i>Blysmus compressus</i>	<i>Didymodon insulanus</i>	1	114	0	1.000
	<i>Bryum pallens</i>	1	114	0	1.000
	<i>Hygrohypnum ochraceum</i>	1	114	0	1.000
	<i>Euphrasia scottica</i>	1	114	0	1.000
	<i>Euphrasia confusa</i>	2	113	0	1.000
	<i>Euphrasia nemorosa</i>	2	113	0	1.000
	<i>Dactylorhiza incarnata</i>	7	108	0	1.000
	<i>Dactylorhiza praetermissa</i>	4	111	2	0.667

<i>Brachythecium rivulare</i>	1	114	1	0.500
<i>Marchantia polymorpha</i>	1	114	2	0.333
<i>Plagiomnium rostratum</i>	2	113	6	0.250
<i>Isolepis setacea</i>	9	106	35	0.205
<i>Salix repens</i> agg.	10	105	44	0.185
<i>Climacium dendroides</i>	4	111	20	0.167
<i>Salix phylicifolia</i>	3	112	15	0.167
<i>Bryum pseudotriquetrum</i>	1	114	5	0.167
<i>Cratoneuron filicinum</i>	1	114	5	0.167
<i>Scorpidium revolvens</i>	2	113	11	0.154
<i>Conocephalum conicum</i>	1	114	6	0.143
<i>Philonotis fontana</i>	2	113	14	0.125
<i>Palustriella commutata</i>	2	113	16	0.111
<i>Tortella tortuosa</i>	1	114	8	0.111
<i>Glyceria notata</i>	5	110	42	0.106
<i>Campylium stellatum</i>	1	114	9	0.100
<i>Puccinellia distans</i>	1	114	9	0.100
<i>Rhinanthus minor</i>	7	108	68	0.093
<i>Trifolium fragiferum</i>	2	113	21	0.087
<i>Primula farinosa</i>	7	108	79	0.081
<i>Triglochin palustre</i>	22	93	320	0.064
<i>Sagina nodosa</i>	8	107	127	0.059
<i>Juncus inflexus</i>	29	86	473	0.058
<i>Homalothecium lutescens</i>	1	114	18	0.053
<i>Juncus balticus</i>	1	114	18	0.053
<i>Pulicaria dysenterica</i>	9	106	197	0.044
<i>Epilobium parviflorum</i>	10	105	219	0.044
<i>Juncus articulatus</i>	60	55	1353	0.042
<i>Eleocharis quinqueflora</i>	10	105	231	0.041
<i>Carex hirta</i>	19	96	455	0.040

<i>Eleocharis palustris</i>	16	99	387	0.040
<i>Carex disticha</i>	13	102	319	0.039
<i>Veronica beccabunga</i>	9	106	227	0.038
<i>Calliergonella cuspidata</i>	11	104	278	0.038
<i>Brachythecium rutabulum</i>	2	113	51	0.038
<i>Veronica anagallis-aquatica</i>	1	114	26	0.037
<i>Cardamine pratensis</i>	17	98	453	0.036

*Gentianella
campestris*

<i>Didymodon fallax</i>	1	233	0	1.000
<i>Pseudocrossidium revolutum</i>	1	233	0	1.000
<i>Fissidens osmundoides</i>	1	233	0	1.000
<i>Phascum cuspidatum</i>	1	233	0	1.000
<i>Racomitrium aciculare</i>	1	233	0	1.000
<i>Weissia controversa</i>	1	233	0	1.000
<i>Euphrasia officinalis</i> subsp. <i>anglica</i>	1	233	0	1.000
<i>Euphrasia salisburgensis</i>	1	233	0	1.000
<i>Euphrasia scottica</i>	1	233	0	1.000
<i>Euphrasia tetraquetra</i>	2	232	0	1.000
<i>Euphrasia micrantha</i>	5	229	0	1.000
<i>Euphrasia confusa</i>	6	228	0	1.000
<i>Euphrasia nemorosa</i>	6	228	0	1.000
<i>Meum athamanticum</i>	2	232	1	0.667
<i>Gnaphalium sylvaticum</i>	5	229	3	0.625
<i>Ophioglossum azoricum</i>	1	233	1	0.500
<i>Alchemilla filicaulis</i>	4	230	7	0.364
<i>Spiranthes spiralis</i>	3	231	7	0.300
<i>Botrychium lunaria</i>	15	219	55	0.214
<i>Alchemilla alpina</i>	9	225	33	0.214

<i>Rhinanthus minor</i>	18	216	68	0.209
<i>Salix repens</i>	11	223	44	0.200
<i>Dactylorhiza purpurella</i>	1	233	4	0.200
<i>Parentucellia viscosa</i>	1	233	4	0.200
<i>Carex rupestris</i>	4	230	17	0.190
<i>Potentilla crantzii</i>	6	228	33	0.154
<i>Carex capillaris</i>	15	222	90	0.143
<i>Chamaemelum nobile</i>	2	232	12	0.143
<i>Filago vulgaris</i>	1	233	6	0.143
<i>Veronica fruticans</i>	1	233	6	0.143
<i>Potentilla anglica</i>	2	232	13	0.133
<i>Primula scotica</i>	5	229	36	0.122
<i>Coeloglossum viride</i>	11	223	87	0.112
<i>Campylium stellatum</i>	1	233	9	0.100
<i>Equisetum variegatum</i>	7	227	64	0.099
<i>Galium sternerii</i>	25	217	241	0.094
<i>Daucus carota</i>	6	228	60	0.091
<i>Carex maritima</i>	1	233	10	0.091
<i>Radiola linoides</i>	1	233	10	0.091
<i>Dryas octopetala</i>	7	227	71	0.090
<i>Sagina saginoides</i>	1	233	11	0.083
<i>Persicaria vivipara</i>	41	205	459	0.082
<i>Salix reticulata</i>	3	231	34	0.081
<i>Tofieldia pusilla</i>	5	229	58	0.079
<i>Alchemilla glabra</i>	3	231	35	0.079
<i>Galium boreale</i>	8	226	101	0.073
<i>Betula pubescens</i>	7	227	89	0.073
<i>Antennaria dioica</i>	19	215	252	0.070
<i>Sesleria caerulea</i>	14	220	192	0.068
<i>Vicia sylvatica</i>	1	233	14	0.067

	<i>Trifolium medium</i>	7	227	102	0.064
	<i>Saxifraga aizoides</i>	20	217	292	0.064
<i>Oenanthe fistulosa</i>	<i>Calliargon cordifolium</i>	1	246	0	1.000
	<i>Drepanocladus aduncus</i>	1	246	0	1.000
	<i>Amblystegium riparium</i>	1	246	0	1.000
	<i>Euphrasia nemorosa</i>	1	246	0	1.000
	<i>Wolffia arrhiza</i>	1	246	0	1.000
	<i>Rorippa nasturtium-aquaticum sens.str.</i>	4	243	0	1.000
	<i>Liparis loeselii</i>	6	241	3	0.667
	<i>Hydrocharis morsus-ranae</i>	8	239	9	0.471
	<i>Sium latifolium</i>	17	230	24	0.415
	<i>Cicuta virosa</i>	21	226	36	0.368
	<i>Carex pseudocyperus</i>	28	219	55	0.337
	<i>Alopecurus aequalis</i>	1	246	2	0.333
	<i>Dipsacus pilosus</i>	1	246	2	0.333
	<i>Lathyrus palustris</i>	12	235	25	0.324
	<i>Ranunculus lingua</i>	33	214	73	0.311
	<i>Elodea nuttallii</i>	4	243	9	0.308
	<i>Oenanthe aquatica</i>	3	244	7	0.300
	<i>Rorippa palustris</i>	3	244	7	0.300
	<i>Stellaria palustris</i>	28	219	70	0.286
	<i>Spirodela polyrhiza</i>	4	243	10	0.286
	<i>Butomus umbellatus</i>	2	245	5	0.286
	<i>Carex appropinquata</i>	24	223	62	0.279
	<i>Veronica catenata</i>	7	240	19	0.269
	<i>Berula erecta</i>	57	190	157	0.266
	<i>Eleocharis acicularis</i>	1	246	3	0.250
	<i>Epilobium roseum</i>	1	246	3	0.250

	<i>Thyselium palustre</i>	60	187	195	0.235
	<i>Carex elata</i>	55	192	180	0.234
	<i>Hottonia palustris</i>	3	244	10	0.231
	<i>Lemna trisulca</i>	12	235	41	0.226
	<i>Rumex hydrolapathum</i>	37	210	129	0.223
	<i>Myriophyllum verticillatum</i>	3	244	12	0.200
	<i>Lemna minuta</i>	2	245	8	0.200
	<i>Azolla filiculoides</i>	1	246	4	0.200
	<i>Cotoneaster simonsii</i>	1	246	4	0.200
	<i>Ranunculus trichophyllus</i>	4	243	17	0.190
	<i>Impatiens capensis</i>	7	240	30	0.189
	<i>Potamogeton coloratus</i>	3	244	13	0.188
	<i>Rorippa amphibia</i>	2	245	9	0.182
	<i>Sagittaria sagittifolia</i>	4	243	19	0.174
	<i>Lysimachia vulgaris</i>	54	193	258	0.173
	<i>Calamagrostis canescens</i>	33	214	158	0.173
	<i>Cladium mariscus</i>	53	195	269	0.165
	<i>Typha angustifolia</i>	18	229	92	0.164
	<i>Schoenoplectus lacustris</i>	8	239	41	0.163
	<i>Carex lasiocarpa</i>	21	226	114	0.156
<i>Polystichum lonchitis</i>	<i>Arabis alpina</i>	1	83	0	1.000
	<i>Woodsia alpina</i>	1	83	0	1.000
	<i>Saxifraga nivalis</i>	7	80	3	0.700
	<i>Dryopteris expansa</i>	2	82	1	0.667
	<i>Draba norvegica</i>	6	81	3	0.667
	<i>Pellia epiphylla</i>	1	83	1	0.500
	<i>Pseudorchis albida</i>	1	83	1	0.500
	<i>Woodsia ilvensis</i>	1	83	1	0.500

<i>Carex atrata</i>	15	73	16	0.484
<i>Veronica fruticans</i>	3	81	4	0.429
<i>Alchemilla alpina</i>	23	61	33	0.411
<i>Draba incana</i>	17	72	26	0.395
<i>Asplenium viride</i>	32	56	50	0.390
<i>Oxyria digyna</i>	35	57	55	0.389
<i>Poa glauca</i>	5	80	8	0.385
<i>Cystopteris montana</i>	1	83	2	0.333
<i>Angelica sylvestris</i>	1	83	2	0.333
<i>Astragalus alpinus</i>	1	83	2	0.333
<i>Carex norvegica</i>	1	83	2	0.333
<i>Erigeron borealis</i>	1	83	2	0.333
<i>Saussurea alpina</i>	25	64	52	0.325
<i>Arabidopsis petraea</i>	5	80	11	0.313
<i>Cerastium alpinum</i>	12	74	29	0.293
<i>Carex vaginata</i>	7	78	17	0.292
<i>Poa alpina</i>	5	80	13	0.278
<i>Saxifraga oppositifolia</i>	42	50	115	0.268
<i>Cystopteris fragilis</i>	23	64	65	0.261
<i>Potentilla crantzii</i>	10	76	30	0.250
<i>Salix reticulata</i>	9	77	28	0.243
<i>Galium boreale</i>	27	64	87	0.237
<i>Sedum rosea</i>	39	54	143	0.214
<i>Salix lapponum</i>	9	79	35	0.205
<i>Arabis hirsuta</i>	11	74	44	0.200
<i>Salix lanata</i>	3	81	12	0.200
<i>Vicia sylvatica</i>	3	81	12	0.200
<i>Salix arbuscula</i>	2	82	8	0.200
<i>Dryas octopetala</i>	15	71	64	0.190
<i>Alchemilla glabra</i>	8	76	35	0.186

	<i>Carex rupestris</i>	4	80	18	0.182
	<i>Pyrola rotundifolia</i>	10	74	49	0.169
<i>Vicia orobus</i>	<i>Ajuga pyramidalis</i>	1	99	3	0.250
	<i>Cotoneaster simonsii</i>	1	99	4	0.200
	<i>Rhinanthus minor</i>	7	93	68	0.093
	<i>Lathyrus linifolius</i>	33	67	357	0.085
	<i>Potentilla anglica</i>	1	99	13	0.071
	<i>Platanthera chlorantha</i>	1	99	14	0.067
	<i>Salix repens</i>	3	97	44	0.064
	<i>Hypericum maculatum</i>	1	99	15	0.063
	<i>Trifolium medium</i>	6	94	104	0.055
	<i>Genista tinctoria</i>	3	97	52	0.055
	<i>Stachys officinalis</i>	29	71	598	0.046
	<i>Carex pallescens</i>	4	96	91	0.042
	<i>Polypodium vulgare sens.str.</i>	4	96	92	0.042
	<i>Vicia sativa</i>	2	98	48	0.040
	<i>Hieracium sp.</i>	7	93	171	0.039
	<i>Platanthera bifolia</i>	1	99	28	0.034
	<i>Asplenium adiantum-nigrum</i>	1	99	42	0.023
	<i>Salix aurita</i>	3	97	143	0.021
	<i>Brachythecium rutabulum</i>	1	99	51	0.019
	<i>Teucrium scorodonia</i>	15	85	855	0.017
	<i>Rosa spinosissima</i>	2	98	121	0.016
	<i>Hypericum pulchrum</i>	11	89	668	0.016
	<i>Lonicera periclymenum</i>	6	94	368	0.016
	<i>Stellaria graminea</i>	7	93	460	0.015
	<i>Sanguisorba officinalis</i>	8	92	532	0.015
	<i>Solidago virgaurea</i>	7	93	466	0.015
	<i>Serratula tinctoria</i>	6	94	412	0.014

<i>Torilis japonica</i>	2	98	141	0.014
<i>Conopodium majus</i>	15	85	1067	0.014
<i>Dactylorhiza maculata</i>	2	98	162	0.012
<i>Lapsana communis</i>	2	98	169	0.012
<i>Centaurea nigra</i>	32	68	2937	0.011
<i>Populus tremula</i>	1	99	95	0.010
<i>Gymnadenia conopsea</i> sens.lat.	2	98	207	0.010
<i>Galium boreale</i>	1	99	108	0.009
<i>Asplenium trichomanes</i>	1	99	111	0.009
<i>Arrhenatherum elatius</i>	27	73	3027	0.009
<i>Cytisus scoparius</i>	1	99	113	0.009
<i>Aira caryophyllea</i>	2	98	227	0.009



