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Ecological determinants of butterfly vulnerability across the European continent

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Abstract:

In drawing up Red Lists, extinction risks of butterflies and other insects are currently assessed by information on status and trends in distribution and abundance. Incorporating information on species traits may increase our ability to predict species responses under environmental change and, hence, their vulnerability. We derived ecologically relevant biological and climatic trait dimensions, and used these to explain the variation in vulnerability indicators for 397 European butterfly species, out of 482 species present in Europe. For all but one vulnerability indicator, climatic traits predicted more variation than biological traits. The biological trait component reflecting mobility, development rate and overwintering stage, proved the major biological determinant of species vulnerability. We propose that this trait component offers a preferable alternative to the frequently used, but ecologically misleading generalist-specialist continuum. Size was a phylogenetically based trait component, and not relevant to explain species vulnerability. Our analysis contributes to develop e trait-based approach to prioritize vulnerable species for conservation at European level. Further regional scale analyses are recommended as a next step to improve the biological basis for species vulnerability.

Keywords: Life-history traits, Vulnerability, Conservation, Red Lists, Butterflies

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Introduction

The worldwide decline of biodiversity leads to losses of a broad array of ecosystem services, such as pollination in agricultural landscapes and recreational and cultural benefits (Nelson et al. 2009, Cardinale et al. 2012, Garibaldi et al. 2013). The European strategy and the Convention on Biological Diversity (CBD) aim to halt biodiversity loss by 2010-2020 (Balmford et al. 2005, European Commission 2011). Accomplishing this objective requires both continuous assessments of biodiversity status and ecological understanding of species vulnerability in relation to their environmental drivers. The threat status is currently assessed by the IUCN Red List methodology with increasingly reliable data from national to continental scales (IUCN 2005, Rodrigues et al. 2006, Keith et al. 2013). Data on insects are still limited however, despite signals that insects are particularly sensitive to environmental change (Thomas et al. 2004, Settele et al. 2008, Rasmont et al. 2015). Butterflies form the exception; their biology is comparatively well studied over a wide range of species and their conservation status is primarily based on population trends and distribution changes derived from decades of systematic monitoring (Van Swaay et al. 2008, 2010, 2011). At present, 37 butterfly species are listed as threatened on the Red List in Europe (9%), but national trends in abundance indicate alarming declines in many species; e.g., 48% in the Netherlands since 1992 and 76% in UK since 1976 (Fox et al. 2015, Van Swaay et al. 2016). Moreover, predictive scenarios of increased economic development and climate change suggest that as much as 78% of European butterfly species may lose >50% of the climatic niche area by 2080 (Settele et al. 2008). However, the ecological understanding of species vulnerability in relation to environmental change remains far from adequate. The growing recognition that the persistence of butterfly populations strongly depends on species' intrinsic life-history characteristics to cope with environmental change, provides the opportunity to derive an mechanistic understanding of the observed population and distribution trends (e.g., Roy et al. 2001, Matilla et al. 2008, Diamond et al. 2011, Newbold et al. 2012, Nieto-Sánchez et al. 2015, De Palma et al. 2015, Eskildsen et al. 2015).

Morpho-physio-phenological and behavioural traits impact fitness via their effects on growth, reproduction and survival (Violle et al. 2007). A set of life-history traits within a species is therefore most likely to be the outcome of long-term environmental selection of fitness and performance qualities for a population to persist (limited by the available phylogenetic space of individual species). Consequently, environmental gradients are often indicative for

 the composition of life-history traits (Carnicer et al. 2013, Leingärtner et al. 2014). Trait-continua in many taxa range from specialized to more generalist species and/or from slow to fast life-styles, and are often the result of growth vs. survival trade-offs that impact performance (Blackburn 1991, Wright et al. 2004, DeVictor et al. 2007, Bielby et al. 2007, Sæther et al. 2011, Janz and Nylin 2008). Previous studies suggest that environmental changes are likely to filter out Lepidoptera species that display a narrow niche breadth (food and habitat), slow development and sedentary behaviour (e.g., Matilla et al. 2006, 2011, Warren et al. 2001, Bartanova et al. 2014, WallisDeVries 2014). Conversely, butterfly species equipped with a set of adaptive traits, including high dispersal capacity, multiple generations per year and broad trophic as well as thermal niches, have the potential to expand their range and initiate adaptive radiations (e.g., Börschig et al. 2013, Ohlemüller et al. 2008).

The transboundary nature of butterfly distributions, environmental change and butterfly conservation efforts across the European continent, justifies up-scaling of trait-based studies. Here, we establish the relationships between trait components and species vulnerability indicators (RL status, endemicity, range size, habitat specialization, natural vs. anthropogenic habitat). We tested if, on a continental scale, (i) species can be ordered along ecologically relevant life-history traits (e.g., specialized to more generalist species, slow to fast life-styles, low to high mobility, narrow to broad climatic requirements), and (ii) that these main will explain a major part of the variation in butterfly vulnerability.

Methodology

Species traits

For 397 European butterfly species, we incorporated five traits associated to species' climatic preferences (i.e., climate optima and breadth of organisms) and six traits associated to species' biology (i.e., morphological, physiological, phenological and behavioural adaptations innate to an organism) (Table 1, Suppl. Mat. Table 1). Climatic traits were adopted from Schweiger et al. (2014) and included species specific niche optima and breadth of temperature, precipitation and soil water moisture content of the distribution area. For temperature and

precipitation, we selected the annual mean and sum respectively, as well as their mean annual range, in order to capture main climatic variation along gradients of latitude, elevation and continentality (Schweiger et al. 2014).

Biological traits included average male/female forewing length and egg-volume. Wing size may play a role in dispersal capacity and survival ability, while egg size can act as a phylogenetic corrective for wing-size, given the allometric slopes between wing-size and egg-size for many butterfly subtaxa (García-Barros 2002). Larval diet breadth is an important limiting factor in butterfly vulnerability, in terms of range size, dispersal capacity and landscape use (e.g., García-Barros & Romo Benito 2010). Species phenology is associated to colonization ability, ranging from restricted climatic environments to wide distributions across a variety of climatic environments. Phenological traits included voltinism (i.e., the average number of generations per year), and overwintering stage (i.e., indicating how early species can reproduce in the season). Vagrancy reflects dispersal capacity and landscape use, and was based on a slightly adapted version of the classification by Dennis et al. (2004), complemented by expert knowledge for a total of 220 species. We used a linear regression model with voltinism, wingspan and range size to explain vagrancy with available data, and made predictions for the remaining 177 species (R² = 0.505, df_{1,219}, SE = 1.128), using the following equation:

Vagrancy = -0.472 + 0.482*(Voltinism) + 0.44*(Wingspan) + 0.001(Range Size)

Species vulnerability

Vulnerability indicators included the *Red List status*, *Endemicity*, *Range size*, species *Affinity for natural habitats* and *Habitat specificity* (**Table 1**). The *Red List status* and *Endemicity* and *Range size* were adopted from Van Swaay et al. (2010); in further analyses *Red List status* and *Endemicity* were treated as binary values (Red List status: 1 if 'Near Threatened' or higher threat category, *Endemicity*: 1 for European endemics), because of small sample size of individual categories. Butterfly *Affinity for natural habitats* was derived from Van Swaay et al. (2006) as recorded occurrence in CORINE biotopes (Moss & Wyatt 1994). Species were categorized species into users of (1) natural landscapes and (2) agricultural land and artificial landscapes (see details in **Suppl. Mat. Table 2**). *Habitat specificity* was assessed on the basis of the above-mentioned habitat use data by Van Swaay et al. (2006), using the species

specialization index (SSI) (Julliard et al. 2006); the SSI takes into account variation in density among occupied habitats, assuming equal densities in occupied habitat and null densities in others. Values for wing size, egg size, range size and SSI were log₁₀-transformed prior to analysis.

Statistical analysis

We applied principal component analysis (PCA) to assess the scores of individual species along the main orthogonal axes of adaptive species traits. We separated biological and climatic traits in order to assess their relative contributions. We repeated PCA trait-based analyses at the level of butterfly families, to assess family-related differences. We chose not to apply further post-correction for phylogeny. Multiple linear least square regressions were used to identify the relative contribution of the species specific PC values (predictive variables) to vulnerability indices (response variables). Analyses were executed in JMP software (Sall et al. 2005).

The trend data underlying the European Red List still rely to a substantial degree on expert opinion due to a lack of systematic monitoring data. Therefore, we checked if the obtained results of the multiple regression of vulnerability indicators against trait components at a European scale were consistent with two more quantitatively based vulnerability indicators at the national scale in the Netherlands: Red List category (on a scale from 1-6; Bos et al. 2006) and abundance trend slopes for the period 1992-2015 from the Dutch Butterfly Monitoring Scheme (Van Swaay et al. 2016)

Results

Trait components on Principal Component Axes

For biological traits, three components explained 78% of trait variation between species (Table 2). The first axis was strongly positively correlated to Vagrancy, Voltinism and Overwintering stage. The second axis was correlated to Size (wing and egg), whilst the third and least important axis was highly correlated to the degree of larval Food plant specialization.

For the climatic traits, we found two equally important axes, explaining 88% of variation (Table 2). The first rotated axis was best represented by a negative relationship between Temperature range on the one hand, and on the other hand, Precipitation range and Species temperature index. The 2nd axis was also correlated to the Species temperature index and in addition to water availability through Annual precipitation and Soil moisture content. Thus, Species temperature index played contributed to both axes.

The correlation between biological and climatic trait components was significant in four out of six cases P<0.01 for r>0.13), but its magnitude was low. The strongest correlation, r=-0.33 between PC-B1 and PC-C2, suggests an association of species from cool, moist climates with biological traits reflecting sedentary behaviour, producing a single generation per year and overwintering in early developmental stages; such trait combinations are typically found in artic-alpine species.

The PC values did vary significantly between butterfly families, but failed to produce significant family contrasts with the exception of one biological trait component (Table 3). Only the size-determined trait component PC-B2 showed substantial phylogenetic differences between families, with smallest values for Lycaenidae and largest in Papilionidae.

Relationship between traits and vulnerability indicators

All five vulnerability indicators were strongly correlated or associated with each other (P<0.0001; generally positively, with the evident exception for Range size which showed negative correlations and associations); only Endemicity and Habitat specificity (SSI) were not significantly correlated with Red List status. The species-specific scores for biological and climatic trait components (**Suppl. Mat. Table 1**), were used to explain the variation in five vulnerability indicators. All five indicators were significantly related to a combination of several biological and climatic trait components. In general, relative contributions from climatic traits were more important to explain species vulnerability than biological traits, with the exception of the vulnerability indicator Affinity for natural habitats.

The explained variation in vulnerability indicators was highest for species Range size (Table 4). The phylogenetically determined component PC-B2 (wing and egg size) was the only one not significantly correlated with

any of the vulnerability indicators. The contribution of trait components to the proportion of explained variation was mostly higher for climatic variables than for biological traits, except for the affinity of species for natural habitats, which was mainly determined by biological traits (Fig. 1). For the latter, the developmental traits were dominant, whilst Food specialism was least important for Affinity for natural habitats.

RL status was least explained by the trait components, but the predicted occurrence of species on the Red List still was adequately explained (83.4% correctly classified; kappa 0.16±0.06 P=0.0002). Species were more likely to be on the Red List in cool and moist climates with high annual ranges in temperature and precipitation. All vulnerability indicators, with the exception of the Red List status, were higher for species with strong host plant specialization. In contrast, vulnerability was lower for vagrant species, for species with large Range size as well as for multivoltine species overwintering at advanced developmental stages.

The response of vulnerability indicators to PC-C1 (annual temperature and precipitation range) was variable; it was positive for RL status, negative for species' Endemicity and Affinity for natural habitats and curvilinear for the other two vulnerability indicators. The results for Range size and Habitat specificity indicate that higher species vulnerability occurs at either low or high values of species specific Temperature and Precipitation ranges. PC-C2 (moisture) also pointed to higher vulnerability at climatic extremes (dry / wet climates) for Red List status, Range size and Habitat specificity, whereas Endemicity was typically higher in wetter climates.

Application to trends in the Netherlands

The Red List status of 73 species native to the Netherlands was explained significantly by the European traits (R²=0.377) with 80% of the explained variation accounted for by the negative relation with the biological traits in PC-B1 (F=27.23, P<0.0001). The climatic component PC-C1 was the only other factor contributing significantly (F=5.34, P=0.024).

Abundance trend slopes of 40 species from the Dutch Butterfly Monitoring Scheme over the period 1992-2015 were explained to a lesser extent by the five trait components (R²=0.260), with only PC-B1 contributing significantly (F=7.19, P=0.011).

Discussion

 Climatic dimensions of butterfly vulnerability

We detected ecologically meaningful trait dimensions, and used these to predict variation in vulnerability indicators for 397 European butterfly species, equivalent to 82% of the 482 species currently recognized for Europe. The dimensions found reflect climatic conditions, mobility, development rate and larval food specialization. Size was a major, phylogenetically based trait component, but was least relevant to explain species vulnerability. Climatic traits predicted more variation in vulnerability indicators, except for species Affinity for natural habitats, which was mostly influenced by biological traits. The low degree of variation at family-level in the trait components affecting species vulnerability, suggested that phylogeny is a minor factor in determining the vulnerability of butterfly species.

We found that species restricted to the extremes of climatic gradients across the European continent are particularly vulnerable. In support of this result, the climatic rarity syndrome hypotheses (Willis and Whittaker 2000, amended by Ohlemüller et al. 2008), postulate that centres of high species rarity coincide with unusual climate conditions, that differ greatly from the surrounding areas. Various centres of high species rarity are higher and colder and harbour numerous isolated relics that presumably resulted from climatic warming since the last ice-age. The organisms in these vulnerable areas will be affected disproportionally by environmental change.

For butterflies, areas of special conservation concern can be found in the Alps, Pyrenees and the Carpathians that face increasing temperatures, shorter snow seasons, longer growing seasons (Ceppi et al. 2012, Brocard et al. 2013, Lindner et al. 2008, Gilbert & Vincent 2013, Beniston 2012). Consequently, species shift to higher elevations (Badeck et al. 2001, Wilson et al. 2005, Lenoir et al. 2010, Karolewski et al. 2007, Vanhanen et al. 2007), or northward in the case of boreal regions (EEA 2009). In addition, climatic variability may strongly impact insect development, predictability of food availability and phenological synchronicity between interdependent taxa (Walther et al. 2005, Vasseur et al. 2014). For the Alps, wetter winter/spring conditions in combination with drier summers are expected (Nemec et al. 2013, EEA 2009). Prolonged droughts are of particular concern for the Mediterranean, Central Europe and the Black Sea region, potentially leading to decreased growth rates, reduced fecundity and survival in insects

(Cannon 1998, Ayres and Lombardero, 2000, Bale et al. 2002, Parmesan 2006, Rouault et al. 2006). These aforementioned areas concur largely with three priority areas for conservation conveyed by traditional biogeography (Glacial Mediterranean refugia, Glacial refugia in the eastern Palearctic and arctic and/or alpine refugia to the North and/or into the high mountain systems), although more potentially important areas have been distinguished since (e.g., Schmitt and Varga 2012).

Biological dimensions of butterfly vulnerability

We found that the "biological trait complex" of voltinism, overwintering stage & mobility explains a large share of variation in species vulnerability. In explaining, well-established population trends and Red List status of butterfly species in the Netherlands, this even proved the major contributing trait component. To a lesser extent, the degree of larval food specialization also constitutes a significant factor determining species vulnerability. These results are in agreement with the regional-scale analysis for North-western Europe (WalisDeVries 2014; see Suppl. Mat. Table 3 for correlations between trait components from that study with the present one), indicating that slow-growing sedentary species are most at risk for the European continent. Similarly, Matilla et al. (2006, 2008, 2011) demonstrated that diet and habitat specificity, overwintering in larval and pupal stages and short flight period and body size predispose Lepidoptera in Finland to distribution decline. Other studies highlighted the role of hostplant growth form and life strategies in relation to butterfly development, voltinism and larval specificity (Dennis et al. 2004, Cizek et al. 2006, 2012, Bartanova et al. 2014). We propose that the abovementioned "biological trait complex" offers a suitable substitute to the widely used, but misleading specialist-generalist continuum (e.g. Dapporto & Dennis 2013). We find the term misleading because the inferred specialization does not have a biological basis, but is rather determined by the modern context of anthropogenic influence instead of the ecological conditions under which species evolved (see WallisDeVries 2014). Indeed, we showed that species affinity with natural habitats was mainly determined by this trait component.

The low but significant correlation between climate and biological traits in this study, may reflect the influence of climatic gradients on the coincidence of plant-host relationships and butterfly phenology. In agreement,

butterflies from the Iberian Peninsula and the Alps, exhibit a trait continuum with altitude, ranging from multivoltine trophic generalists with high dispersal capacity and broad climatic niches, to univoltine, trophic specialist species with restricted dispersal and narrow climatic niches (Carnicer et al. 2013, Leingärtner et al. 2014).

Challenges and opportunities in conservation

Trait-based approaches to species vulnerability pose certain limitations. Shifts in response to climate warming vary greatly among species, suggesting that range shifts depends on multiple species traits and external drivers of change (e.g. Chen et al. 2011), while potentially important traits may not be included for all species, due to gaps in knowledge of species ecology. Detailed trait information, such as was available for species from Northwestern Europe (WallisDeVries 2014), remains to be collected for many other European species. We did initially consider a number of additional traits (host plant growth form, aestivation, altitudinal limits, as well as other climatic variables, such as standard deviation of temperature and precipitation), but we decided to exclude them from the analysis due to methodological issues of trait variation and correlations between climatic variability and range size. Also we chose not to do detailed phylogenetic corrections, since taxonomic data are still incomplete (e.g., taxonomical changes for cryptic species). Moreover, there is considerable debate about the added value phylogenetic correction in trait-based studies, and in fact, numerous studies showed that correlative patterns among life-history traits remain largely undistorted even after a correction for phylogeny (Matilla et al. 2006, 2008, 2011, Päivinen et al. 2005, Wilson et al. 2004, Pavoine et al. 2012, Bartanova et al. 2014, Leingärtner et al. 2014). However, increasingly detailed trait data might also reveal regional differences for traits of the same species. Traits are, after all, primarily the result of environmental adaptation and filtering. Also evolutionary plasticity of traits likely varies between species and between populations of the same species. Depending on the genetic variation and environmental pressure, traits continue to change. A final point of attention, is that endemicity was typically higher in wetter climates, but as Europe constitutes the northwestern Edge of the Palaearctic region, as good as all species preferring dry or steppic conditions are not endemic (most of them also occur in Asia or Africa), making endemicity a biased variable.

In spite of the limitations, this study clearly shows a weak response of the Red List status in relation to species traits, which begs the question if the Red List status should be more strongly rooted in a biological basis. An important candidate for improving underlying biological arguments, could be the trait complex of voltinism,

overwintering stage & mobility. Here, we propose a tentative list of 56 candidate Red List species with below-median values for PC-B1 and for range size (Suppl. Mat. Table 4; a further 18 species meeting these criteria are already on the Red List). Similar attempts to predict extinction risk using multiple ecological traits, Kotiaho et al. (2005) for instance, revealed that threatened butterflies are characterized by narrow niche breadth, restricted resource distribution, poor dispersal ability, and short flight period. Based on this study, they were able identify seven vulnerable species for which the conservation status should be reconsidered in Finland.

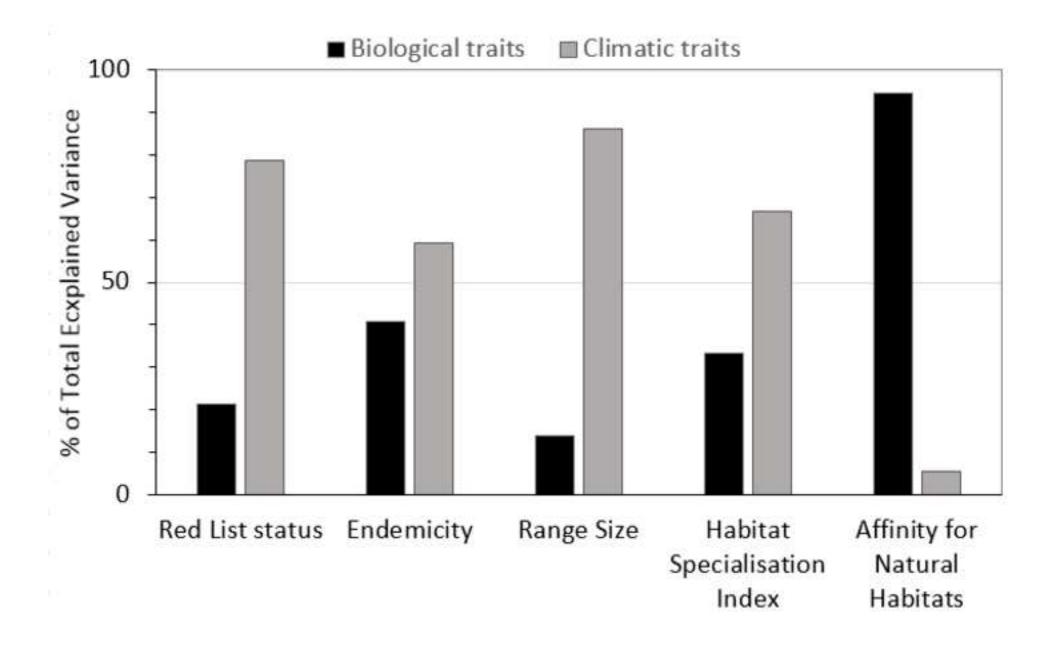
Complementary regional analyses, for which specific biological trait information is more complete and climatic variation is less pronounced are still necessary to deepen our mechanistic understanding of species vulnerability. For the present study, the variation in climatic conditions across broad spatial scales is large, e.g., variation in continentality / oceanity with longitude or daily as well as seasonal variation in temperature and precipitation regimes with latitude and altitude (Settele et al. 2013, Schweiger et al. 2014). Again here, it seems advisable to distinguish regions on ecologically relevant grounds. Thermoclimatic conditions relevant to butterflies may, for instance, be incorporated as variables to select geographical areas for further disentanglement of biological traits in spatially explicit studies.

In conclusion, this analysis provides a basis to identify ecologically relevant species groups and prioritizes vulnerable species for conservation at European level. Although trait information is still limited at the European scale, our study indicates its potential to assess species vulnerability. Species vulnerability indicators were significantly determined by species specific traits, primarily climate requirements. Furthermore, the biological trait complex reflecting mobility, development rate and overwintering stage proved another consistent determinant of species vulnerability that may be used to replace the anthropogenically determined specialist-generalist continuum. Further systematic regional scale analyses are recommended as a next step to improve the biological basis for species vulnerability.

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	Variables	Data scale	Values			
aits	Vagrancy	Ordinal	(1) rare record ex habitat, (2) occasional colonization events over <10 km, (3) urban areas and gardens, (4) occasional colonization events over >10 km, (5) rapid range expansions over >100 km in 10 years, (6) short-distance overseas dispersal - at sea records - island populations, (7) incidental long-distance (mass) movements, (8) regular reversed long distance migrations			
al tr	Voltinism	Ordinal	(1) 0.5, (2) 1, (3) 1–2, 4) 2, (5) 2–3, (6) 3–4 (generations per year)			
Biological traits	Overwintering	Ordinal	(1) egg), (2) first instar larva, (3) half-grown, (4) last instar, (5) pupa, (6) adult, (7) no hibernation			
ш	Wing size	Continuous	mm (average male / female)			
	Egg volume	Continuous	mm³			
	Specialization	Ordinal	(1) polyphagous (multiple species, >1 plant family), (2) polyphagous (multiple species, 1 plant family), (3) oligophagous, (4) monophagous			
-	Temperature index	Continuous	°C (monthly average across species range)			
Climatic traits	Precipitation sum	Continuous	mm (annual sum across species range)			
tic tı	Temperature range	Continuous	°C (maximum – minimum monthly average across species range)			
lima	Temperature range	Continuous	mm (maximum – minimum monthly average across species range)			
S	Soil water content	Continuous	Units 0 to 1, water availability in the upper horizon (0.5 m)			
>	Red List status	Binary	(0-1); 0) least concern, 1) near threatened, vulnerable endangered or critically endangered			
billit	Range size	Continuous	Occupancy in number of 50 km² grid cells			
Vulnerability	Endemicity	Binary	(1) European endemics, (0) species also occurring outside Europe			
	Habitat use	Binary	(0) natural, (1) anthropogenic			
	Habitat specificity	Continuous	SSI index*			

Table 1. Species traits and indicators for species vulnerability used in this study. *See text.

	Biological t	raits	Climate traits			
Rotated PCs	PC-B1	PC-B2	PC-B3	PC-C1	PC-C2	
Variance	1.99	1.68	1.01	2.20	2.19	
% Explained	33.2	28.0	16.8	44.1	43.7	
Vagrancy	+0.83	-0.26	-0.10			
Voltinism	+0.84	+0.19	+0.02			
Overwintering stage	+0.71	+0.04	-0.05			
Wingspan	+0.18	-0.91	+0.01			
Egg Volume	-0.21	-0.86	-0.07			
Foodplant specialisation	-0.08	0.04	+0.99			
Range Annual Temperature				+0.92	-0.05	
Range Annual Precipitation				-0.85	+0.05	
Species Temperature Index				-0.74	-0.65	
Soil Water Content				+0.16	+0.96	
Annual Precipitation				-0.25	+0.91	
PC-C1	-0.15	+0.01	-0.15			
PC-C2	-0.33	-0.09	-0.13			

Table 2. Principal components of trait associations for 384 European butterfly species with correlation coefficients of trait variables with the rotated principal component axes. The strongest correlations for each variable have been marked in bold. Correlation coefficients between biological and climatic trait components are listed below. (PC: Principal Component of combined traits, B for biological and C for Climatic traits).

		Biological traits			Climate traits	
Family	N species	PC-B1	PC-B2	PC-B3	PC-C1	PC-C2
Hesperiidae	43	-0.23 ^b	+0.53 ^b	-0.09 ^{ab}	-0.12 ^a	-0.10 ^{ab}
Lycaenidae	ae 104 +0.02 ^b		+1.10 ^a	+0.27 ^a	-0.03 ^a	-0.25 ^b
Nymphalidae	e 193 -0.20 ^b		-0.63 ^d	-0.12 ^b	+0.03 ^a	+0.22ª
Pieridae	43	0.96ª	+0.04°	-0.09 ^{ab}	+0.16ª	-0.24 ^{ab}
Other	14	+0.34 ^{ab}	-1.22 ^e	+0.19 ^{ab}	0.19 ^{ab} -0.39 ^a	
		F _{4,392} =14.4****	F _{4,70.6} =142.3****	$F_{4,70.6} = 2.9^*$	$F_{4,392} = 1.0^{ns}$	F _{4,70.9} =4.7**

Table 3. Mean values of biological and climatictrait components for different butterfly families. Species of families Papilionidae (N=13) and Riodinidae (N=1), were grouped in "Other". Different Letters a-e indicate significant differences between families (Tukey HSD); F-values from ANOVA with lower d.f. values after accounting for inhomogeneity of variances (significance: * P<0.05, ** P<0.01, **** P<0.0001). (PC: Principal Component of combined traits, B for biological and C for Climatic traits).

		Biological traits			Climate traits				
Variable	Regression type	PC-B1	PC-B2	PC-B3	PC-C1	PC-C12	PC-C2	PC-C22	R ²
Red List status	Logistic	4.8 ⁻	2.8 ^{ns}	0.1 ^{ns}	12.3***		5.0 ⁻	11.0+++	0.105
Edemicity	Logistic	19.4	1.5 ^{ns}	14.1***	35.8		15.3****		0.272
Range Size	Least Squares	68.6****	0.3 ^{ns}	27.4	128.4****	172.8	127.2****	175.9	0.638
Habitat specificity	Least Squares	96.1	0.9 ^{ns}	6.0+	62.8	51.4****	23.9	69.0****	0.487
Affinity for Natural Habitats	Logistic	63.0	0.0 ^{ns}	6.7**	4.0 ⁻		0.0 ^{ns}		0.364

Table 4. Results of the multiple regression between species-specific vulnerability indicators and Principal Component of combined traits, B for biological and C for Climatic traits (significance: * P<0.05, ** P<0.01, **** P<0.0001).

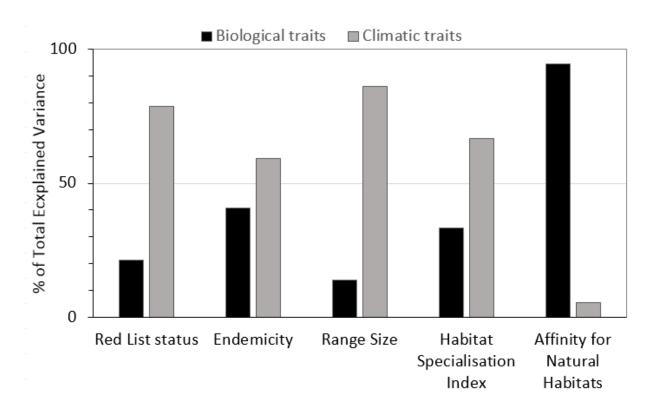


Figure 1. Relative contribution (out of 100%) of biological traits (black bars) and climate traits (grey bars) in explaining variation in vulnerability indicators for European butterfly species.

Supplementary material in separate Exel file attached.

Suppl. Mat. Table 1: Species list of European butterflies used in this study, with *Red List categories* (LC least concern, NT near threatened, VU vulnerable, EN endangered, CR critically endangered, NA not assessed), *Endemicity* and *Range size* from van Swaay et al. (2010), Species specialization index (SSI) based on Julliard et al. (2006), *Affinity for natural habitat* as recorded occurrence in CORINE biotopes (Moss & Wyatt 1994), and correlation scores with PCA axes (B for biological variables and C for climatic variables).

Suppl. Mat. Table 2: Classification of Corine habitat types as natural, anthropogenic or indistinct (i.e. if habitat types may be natural, but often are significantly modified by anthropogenic influence). Species classification after relative proportion of habitat mentions in Van Swaay et al. (2006). Classification criteria were: (i) exceedance of the median value of the percentage of habitat mentions in either natural or anthropogenic habitats, (ii) the difference in percentage of habitat mentions in natural habitats minus the percentage in anthropogenic habitats being 50% or greater, (iii) the percentage of habitat mentions in indistinct habitats: if this was >50%, then species were only assigned as 'anthropogenic' if the percentage in anthropogenic habitats exceeded 10%, (iv) for 8 species exclusively listed in indistinct habitats, we assigned an intermediate value of 0.5.

Suppl. Mat. Table 3: Correlations between the species scores of five main trait component from this study and values from the four main trait components for 145 nortwest-European butterfly species from WallisDeVries (2014) (significance: * P<0.05, ** P<0.01, **** P<0.0001).

Suppl. Mat. Table 4: A tentative list of 56 candidate Red List species (present status LC or NA) with below-median values for PC-B1 and for range size (in number of occupied 50x50 km grid cells); a further 18 species that satisfy the criteria already are included on the Red List (status NT, EN or CR). Red List categories: LC least concern, NT near threatened, VU vulnerable, EN endangered, CR critically endangered, NA not assessed).

Supplementary Material (Video Files)

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