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#### 24 Abstract

Insects have diversified through 400 million years of Earth's changeable climate, yet recent and 25 ongoing shifts in patterns of temperature and precipitation pose novel challenges as they 26 combine with decades of other anthropogenic stressors including the conversion and degradation 27 of land. Here we consider how insects are responding to recent climate change, while 28 summarizing the literature on long-term monitoring of insect populations in the context of 29 climatic fluctuations. Results to date suggest that climate change impacts on insects have the 30 potential to be considerable, even when compared to changes in land use. The importance of 31 climate is illustrated with a case study from the butterflies of Northern California, where we find 32 that population declines have been severe in high-elevation areas removed from the most 33 immediate effects of habitat loss. These results shed light on the complexity of montane-adapted 34 insects responding to changing abiotic conditions and raise questions about the utility of 35 temperate mountains as refugia during the Anthropocene. We consider methodological issues 36 that would improve syntheses of results across long-term insect datasets and highlight directions 37 for future empirical work. 38

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#### 40 Key words

41 Anthropocene, climate change, population decline, extinction, extreme weather

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## 45 Significance statement

- <sup>46</sup> Anthropogenic climate change poses multiple threats to society and biodiversity, and challenges
- 47 our understanding of the resilience of the natural world. We discuss recent ideas and evidence
- 48 on this issue and conclude that the impacts of climate change on insects in particular have the
- <sup>49</sup> potential to be more severe than might have been expected a decade ago. Finally, we suggest
- <sup>50</sup> practical measures that include the protection of diverse portfolios of species, not just those
- inhabiting what are currently the most pristine areas.

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From invasive species to habitat loss, pesticides and pollution, the stressors of the Anthropocene 55 are many and multi-faceted, but none are as geographically pervasive or as likely to interact with 56 all other factors as climate change (1, 2). For these reasons, understanding the effects of 57 anthropogenic climate change on natural systems could be considered the defining challenge for 58 the ecological sciences in the  $21^{st}$  century (3). It is of particular interest to ask how insects will 59 respond to recent and ongoing climate change, because they are the most diverse lineage of 60 multicellular organisms on the planet, and of fundamental importance to the functioning of 61 terrestrial ecosystems. The issue also has new urgency in light of recent and ongoing reports of 62 insect declines from around the globe (4). Insects and climate change have been discussed 63 elsewhere (5-8), and our goal here is not to cover all aspects of the problem. Instead, we focus 64 on recent discoveries and questions inspired by long-term records of insect populations, 65 discussing other fields (e.g., physiological ecology) where they inform our understanding of 66 population trajectories under climate change scenarios. 67

In the sections below, we compare climate change to other stressors and examine 68 multifaceted impacts in terms of climate means, limits and extremes. Then we discuss the 69 geography of climate change with particular focus on the responses of montane insects, with a 70 case study from the butterflies of Northern California that illustrates the value of long-term 71 observations that span a major gradient of land use intensity. Two areas that we do not cover in 72 detail are the theoretical foundations of climate change research (9), and community-level 73 consequences including altered trophic interactions associated with shifting phenologies (10). 74 As a qualitative survey of the state of the field, we have gathered insect monitoring studies 75

(based on a review of more than 2,000 papers) that encompass at least 10 years of continuous
sampling and analyses of climatic data (Table 1). We excluded studies of pest species and
studies from agriculture, as well as projects encompassing fewer than 10 species (as a way to
focus on assemblages of species rather than model systems). In general, we emphasize
monitoring studies as unparalleled opportunities for understanding the influence of climatic
fluctuations on animal populations because of the ability to decompose complex temporal trends
into effects driven by different factors (11, 12).

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#### 84 On the relative importance of climate change and other stressors

Although Anthropocene stressors must ultimately be understood as an interacting suite of factors 85 (13), it is useful to start by asking: how will the consequences of climate change compare to 86 other stressors? Over the last three centuries, the global percentage of ice-free land in a natural 87 state (not intensively modified by human activity) has shrunk from 95% to less than 50% (14), 88 with consequences that include the extirpation and extinction of plants and animals (15). 89 Although habitat loss (including degradation through pollution and numerous other processes) 90 continues, it is possible that we are living through a period of transition where the importance of 91 changing climatic conditions could begin to rival the importance of habitat loss (16, 17). That 92 transition and the rise of climate change as a more severe threat could happen through a number 93 of related processes. A very partial list would include the inability to disperse quickly enough to 94 track changing conditions (18), or the phenomenon of dispersal out of previously suitable habitat 95 into regions where habitat is suboptimal or cannot be found at all (19). There is also the 96 possibility that abiotic stress associated with changing climatic conditions could simply be the 97

last straw, reducing vital rates below replacement levels as a result of physiological stress in
populations already pushed to the edge by other stressors (5).

An empirical understanding of the effects of climate change in comparison to other 100 stressors depends in large part on long-term observations from protected areas or from gradients 101 of land use that will let us directly compare the effects of different factors. In Great Britain, both 102 land use and climate change have been important for explaining the decline of 260 species of 103 macro-moths and an increase of 160 species (out of a total of 673 species) (20). The signal of 104 habitat loss is seen in widespread species, which have declined in regions with increased 105 intensity of human land use. At the same time, the role of climate can be seen in the decrease of 106 more northern, cold-adapted species and the simultaneous increase of more southern, warm-107 adapted species (20). Less multifaceted signals of global change can be found in smaller areas 108 sheltered from direct effects of habitat loss. Beetle activity in a protected forest in New 109 Hampshire has, for example, decreased by 83% in a re-sampling project spanning 45 years, 110 apparently as a function of warmer temperatures and reduced snow pack that insulates the 111 diverse ground-dwelling beetle fauna during the coldest months (21). In a headwater stream in a 112 German nature preserve that has been isolated from other anthropogenic stressors (besides 113 114 climate change), abundance of macroinvertebrates has declined by 82% over 42 years and mean emergence is more than two weeks earlier, while species richness has increased (22). It is 115 important to note that a signal of climate has not been found in all long-term studies of insects, 116 even those from protected areas. In a sub-arctic forest in Finland, moth populations are primarily 117 stable or increasing and these trends do not appear to be strongly related to warming 118 temperatures (23). It can also be noted that the literature on long-term responses of insect 119 populations to climate is neither deep nor geographically broad, which is an important 120

conclusion from Table 1, where it can be seen that most studies come from Northern Europe and
 Lepidoptera are disproportionately represented, as others have noted (4).

Beyond the direct effects of climate change, we can ask: how will changing climatic 123 conditions interact with habitat loss, invasive species, pesticide toxicity (24), and other factors? 124 This is an area that is ripe for experimental work (11), but the number of potentially interacting 125 factors that could be tackled in an experiment is daunting, which is why experiments will 126 profitably be inspired and focused by observational results. The challenge for researchers with 127 long-term data is to develop statistical models that encompass interactions rather than focusing 128 only on main effects that might be easier to interpret. A notable example of modeling 129 interactions in the context of global change comes from a recent study of British insects, where 130 researchers found that the most successful model for poleward range shifts included habitat 131 availability, exposure to climate change, and the interaction between the two (25). 132

Our reading of the literature comparing climate to other drivers of change suggests a few 133 methodological issues that could be better aligned across future studies. Results from analyses 134 of weather and insect populations should be reported as standardized beta coefficients, and 135 summarized at both seasonal and annual scales; finer scales may be appropriate for certain 136 questions or datasets, but those two broader scales would facilitate comparisons among studies. 137 Whenever possible, year or time as a variable should be included in models with weather 138 explaining insect population or community data. Conditioning on year strengthens the inference 139 of causation, especially when variables (insects and climate) are known a priori to be 140 characterized by directional change. When year cannot be included in models because of high 141 collinearity with weather or other variables, first order differencing or other methods of trend 142 decomposition should be considered (12). 143

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#### 145 On changing maximums, minimums, means and variance

Climate change is of course not one phenomenon, and axes of change include shifts in limits 146 (maximums and minimums), average conditions and variance, which can all be measured at 147 different temporal and spatial scales. The multifaceted nature of climate change is illustrated by 148 the fact that nighttime temperatures are warming faster than daytime conditions (26), and the 149 consequences for insects are poorly-understood but potentially serious, including reduced time 150 for recovery from daytime heat stress, and indirect effects through plants (26). In the mountains 151 of California, rising average daily minimum temperatures had some of the most dramatic 152 negative effects on insects, especially in combination with drier years (27). Rising minimum 153 temperatures in particular seasons might impact insects through effects on critical overwintering 154 stages. In the UK, the annual population dynamics of moths are affected by overwintering 155 temperature and precipitation (28). In this case, winter precipitation has a negative association 156 with moth abundance, while winter temperature has a positive association (28). In Greenland, 157 changes in the structure of arthropod communities over 18 years have been influenced by 158 warming summers and falls and fewer freeze-thaw events, with the most negative associations 159 observed for surface detritivores (29). On the other side of the temperature spectrum is 160 maximum temperature, which has been shown to be the variable most associated with local 161 extinctions in a global survey of insects and other taxa (18). 162

While our understanding of biotic response to warming means and limits improves, the greater challenge of changing variance is now upon us: predictions for many parts of the world include an increased frequency of extreme weather, which can appear as more intense precipitation events separated by more prolonged dry periods (30). We have few studies on this

topic from which to draw conclusions; only five studies in Table 1 explicitly investigated 167 extreme weather events (27, 31-34). In the few cases where biotic response to extreme events 168 has been examined, the results are as we might expect: extreme events are extreme population 169 stressors. Large, synchronized population swings of Lepidoptera in the UK are associated with 170 extreme climate years and responses to these years were negative in 5 out of 6 cases (32). On a 171 continental scale, a recent re-survey of 66 bumble bee species across two continents points to 172 temperatures outside of historical ranges as a major driver reducing occupancy across the 173 landscape (35). Salcido et al. (31) report an increase in extreme flooding events as one of the 174 factors contributing to the loss of parasitoids and Lepidoptera in a Costa Rican forest, which 175 includes the disappearance of entire genera of moths (minimum temperatures also had strong 176 negative effects, consistent with other results discussed above). 177

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### 179 On the geography of biotic response to climate change

An important test of our understanding of ectotherm response to abiotic conditions is the extent 180 to which we can understand and predict responses of insects living in different biomes or 181 climatic regions (36). It has been suggested that tropical insects are more sensitive to warming 182 conditions because they are already at their optimal temperatures, and are thus closer to 183 detrimental thermal maxima relative to temperate insects (37); this is, however, an area of 184 ongoing investigation (38). A related issue is the effect of climate change along elevational 185 gradients, and at least a few expectations align to suggest that montane insects could fare better 186 in climate change scenarios as compared to insects in less topographically complex environments 187 (39). First, montane insects have the opportunity for upslope shifts in range, and the tracking of 188 similar environmental conditions in space is potentially the best buffer against changing 189

conditions. Second, montane insects have access to a greater diversity of microhabitats, which 190 could allow for behavioral thermoregulation even without changes in elevational range. Third, 191 relative to lowlands that are degraded in many parts of the world (because of the concentration of 192 agriculture or urban areas), insects on mountains will often find a greater diversity of plant 193 resources, which (at least for herbivorous insects) should provide some buffer against climate-194 induced changes in the plant community. Are these expectations borne out by long-term records 195 of insect populations? The answer to that question has applied relevance because it affects how 196 we think about land protections, and whether or not mountains can be climate refugia during the 197 upheavals of the Anthropocene (40). 198

Few insect monitoring programs encompass extensive elevational gradients, but one exception is the Shapiro Transect across Northern California: ten sites and 163 species of butterflies over more than 2500m of elevation, including a severe gradient in land use, from the intensely modified Central Valley to above tree line in the Sierra Nevada (Fig. 1A and B). Observations have been taken every two weeks during the butterfly flight season for between 32 and 48 years, depending on the site; details of data collection have been described elsewhere (41–43).

Previous modeling work has highlighted the complexity of population response to weather in this diverse fauna (41), and has documented the array of factors impacting populations along the elevational and land use gradient. At lower elevations, the loss of open spaces, warming summers and pesticide application have been associated with widespread declines (42, 44), while the impact of climate change and an extreme drought have been more apparent at higher elevations (27). Here we revisit the question of climate change impacts in this system (with an additional three years of data), with an emphasis on understanding species-

specific traits that predict persistence in the mountains. We also revisit a previously-described
 upslope shift (43) with an additional 13 years of data to ask if elevational dynamics were
 impacted by the mega-drought of 2011-2015.

Montane and valley populations have, on average, followed downward trajectories (Fig. 216 1C and D). Populations at low elevations have been trending downward for a greater span of 217 years, while montane populations appear to have been relatively steady through the 2000s, but 218 were severely impacted following 2011 (the start of the drought years). Roughly speaking, this 219 comparison is between populations affected by all of the major Anthropocene stressors (in the 220 Central Valley) and populations affected primarily by a changing climate (in the mountains). 221 The mountains are not without some land conversion and incursions of invasive plants along 222 roadways, but for the most part our sites are in undisturbed natural areas. Thus, it is noteworthy 223 that the montane declines have reached almost one half of a standard deviation away from the 224 mean (relative to the long-term average), matching roughly the depth of decline in the valley. 225 The inset density plots in Fig. 1C and D reflect the distribution of demographic trends in 226 the two regions: the bulk of coefficients (associated with years in multiple regression models) are 227 negative (reflecting downward trajectories) in both cases, but not all species are in decline. With 228 respect to the mountains, it is of interest to ask if species with better performance are species that 229 have been observed with greater frequency at the highest elevations, which would be consistent 230 with a bioclimatic (upslope) niche-tracking model. We have updated (in Fig. 1E) an earlier 231 analysis (43) from before the mega-drought years, and confirm that butterflies were on average 232 being observed at slightly higher elevations in later (2002-2010) vs earlier (1977-1985) years; 233 the distribution of those elevation changes in Fig. 1E is positive and upslope (t = 3.82, df = 116, 234

p < 0.001). A shift in average elevation of occurrence (or change in central tendency of

elevational range) is consistent with vegetation dynamics observed in another California
mountain range (45). In contrast, when the early vs late comparisons encompass the drought
years in a recent (Fig. 1F) or broader span of years (Fig. 1G) it can be seen that the elevational
changes are more evenly balanced with both upslope and downslope shifts. This is not unlike
the complexity of upslope and downslope responses observed in other taxa in the same mountain
range (46, 47).

The severe declines of the drought years in Northern California have in effect cancelled 242 out the earlier upslope signal, which leaves us with the question of whether or not success (or 243 failure) in the mountains in recent years can be predicted based on species-specific traits. We 244 took a constrained ordination approach (redundancy analysis) to understand montane butterfly 245 populations over time in the context of potential predictors that include voltinism (number of 246 generations per year), habitat association, overwintering biology, sensitivity to specific weather 247 variables, and other traits. Focusing on the west slope locations (relevant to our measure of 248 elevational population dynamics in Fig. 1 E-G), we see that the most successful montane species 249 can be characterized as mostly resident (reproducing at our sites), univoltine species with earlier 250 emergence and positive responses to precipitation and average minimum daily temperatures (Fig. 251 2). The converse is that declining montane species (in the lower half of Fig. 2) have a negative 252 association through time with minimum temperatures, which is consistent with a previous 253 analysis, focused on species richness (27), that hypothesized rising minimum temperatures as a 254 driver of declining montane butterflies. The association with precipitation sensitivity suggests 255 that a successful subset of the montane fauna not only persists with warming nights but is able to 256 take advantage of the highly variable precipitation of the region (27). 257

Declining populations in the mountains (in the lower half of Fig. 2) tend to be weedy, 258 multivoltine habitat generalists with broad geographic ranges. This result is perhaps 259 superficially surprising given the resilience of generalist species in other contexts (48, 49), but 260 was predicted ten years ago for the montane Northern California fauna (43), and has been seen 261 for multivoltine butterflies in another seasonally hot and dry Mediterranean climate (50). For 262 most species, the warm season at higher elevations is not long enough to support true 263 multivoltinism (51), thus species with many generations per year depend on demographic 264 contributions from lower elevations, where populations have been failing for at least two decades 265 (Fig. 1D). It is interesting to note that having multiple generations per year, however, conveyed 266 the opposite effect at the lowest elevations during an extreme weather event, where we observed 267 that multivoltinism combined with early springs allowed valley populations to reach higher 268 densities during the drought years of 2011-2015, which can be seen in Fig. 1D (27). 269 These results, which encompass between 100 and 142 butterfly species (depending on the 270 analysis), challenge some of the expected patterns of biotic response to climate change. First, 271 montane microclimatic heterogeneity might not be a strong buffer against climate change. 272 Declines in the mountains are comparable to declines in the Central Valley, which is 273 experiencing other anthropogenic stressors and contains less climatic variation over short 274 distances. These results highlight the power of long-term data to quantify climate sensitivities 275 along with natural history when understanding population trajectories under climate change. 276 These results also bring into focus the complexities faced by organisms when traits (such as 277 voltinism) confer different advantages and disadvantages at locations that are potentially within 278 dispersal distance but separated by elevational, climatic, and habitat differences. 279

#### 281 Conclusions and practical lessons

Reports of insect declines in the scientific and popular press have been greeted with surprise, 282 which could reflect an inherent bias that even scientists have towards assuming that the smallest 283 and most diverse animals on the planet would somehow be more robust than, for example, 284 amphibians or birds. Insects have, after all, seen more than 400 million years of climate change. 285 Can recent and ongoing climate change be that different from others that insects have weathered? 286 In previous periods of change, we know from the paleontological record that individual beetles 287 have relocated across continents (52). As can be seen from Table 1, there are relatively few 288 studies where long-term records of insect populations (with 10 or more continuously-sampled 289 years) have been analyzed in the context of climatic fluctuations. Even more important, only 290 two of those studies are from tropical areas (31, 53), where the majority of insects live, which 291 thus represents a major gap in our understanding of terrestrial biodiversity in the Anthropocene. 292 Nevertheless, considering results from the studies in Table 1 along with spatial or occupancy 293 surveys (e.g., 18), conclusions do emerge. Ongoing climate change will have positive effects on 294 some species and negative effects on others (54, 55), with the balance (of positive and negative 295 effects) determined in some cases by geographic factors such as latitudinal position (20, 37) and 296 in other cases by more complex species-specific traits (6, 7), as in the Northern California case 297 study (Fig. 2). Extreme weather events or prolonged stretches of weather outside of historical 298 conditions will have more consistently negative effects across species (4, 56), although this in an 299 area where additional research is urgently needed. 300

Moreover, the combination of climatic effects with habitat degradation will certainly have interacting consequences (34, 43), which leads to the conclusion that the current crisis is indeed different than previous periods of Earth history, for the reason that the planet has changed

in so many other ways as a result of the increasingly rapid conversion and loss of natural 304 resources associated with the Anthropocene (13). The modernization of agriculture has removed 305 the weedy edges, previously open land has been paved (42), and prolonged droughts have 306 compressed and fragmented tropical cloud forests (56). Nevertheless, we believe that the study 307 of long-term insect records offers some tangible hope and practical lessons. In all but the most 308 severe cases, there are some species that manage to take advantage of anthropogenically-altered 309 conditions (55). Unlike animals with larger home ranges and greater per-individual resource 310 requirements, insects are remarkable in the speed with which they respond to a bit of hedgerow 311 improvement or even a backyard garden. In our own experience, we have been surprised by the 312 resilience of the low elevations of Northern California (27). Some of these places are far from 313 land that you might spot as a target for protection: rights of way, train tracks, levees, or drainage 314 ditches. Yet it was the butterflies in those places that proved to be the most robust during the 315 mega-drought. In the mountains, we have reported success conferred by combinations of traits 316 that could only have been partly predicted by previous work. Of course, the butterflies at low 317 and high elevations in California still continue a downward trajectory of which climate plays no 318 small part, but if other stressors could be alleviated it might be the case that insects even in close 319 proximity to human development will continue to do what insects do best: survive. 320

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#### 322 Methods

The literature search was performed on ISI Web of Science in February 2020 using the search terms TS=(insect\* OR lepidoptera\* OR hymenoptera\* OR diptera\* OR hemiptera\* OR coleoptera\* ) AND TS=(climate OR weather) AND TS=("long term" OR "long-term" OR monitor\*), which identified 2,264 studies. To be included in Table 1, we considered studies that

included at least 10 insect species for at least 10 years. Additionally, studies must have either
 been restricted to a protected area or span a gradient of land use types (e.g., from developed to
 protected); and by "protected" we mean relatively isolated from land conversion rather than any
 legal or political designation.

Analyses of Northern California butterfly data involved visualization of population trends 331 averaged at the site level, estimation of population trends at the species level, calculations of 332 changes in mean elevation of occupancy per species, and ordination of inter-annual population 333 variation in association with natural history traits. Full details on all methods are given in SI 334 Appendix material, but in brief our visualization of populations (in Fig. 1C and D) was based on 335 z-transformed probabilities of observation that we have shown to be indices of abundance (57). 336 Estimation of coefficients summarizing population change over time (insets in Fig. 1C and D and 337 shading of points in Fig. 2) is based on hierarchical Bayesian binomial models as presented in 338 previous work with this data (41). Changes in average elevation per species (Fig. 1E-G) used 339 sample- (or visit-) based rarefaction to impose an equal number of simulated visits to a site in 340 repeated resampling to calculate differences between time windows. The specifics of time 341 windows were motivated by a desire to understand change before, during and after a millennium 342 drought (2011-2015) that was the single most impactful climate event (during our records) on the 343 montane populations. Finally, redundancy analysis (RDA) combined many lines of information 344 into one picture of population-specific change over time with respect to population-specific traits 345 (Fig. 2). 346

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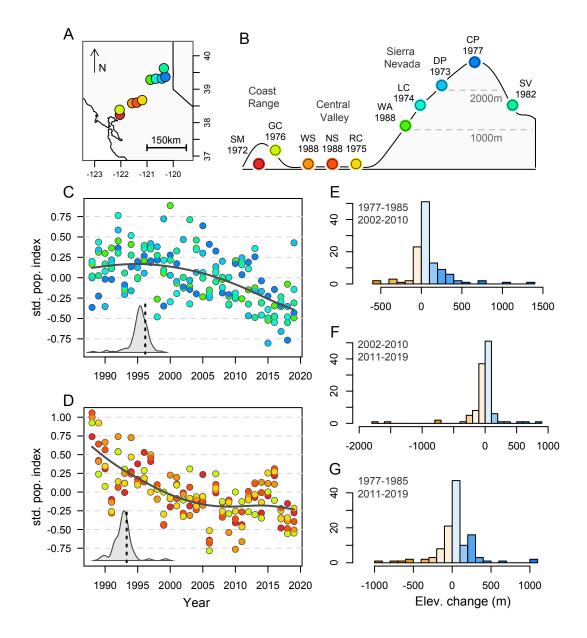
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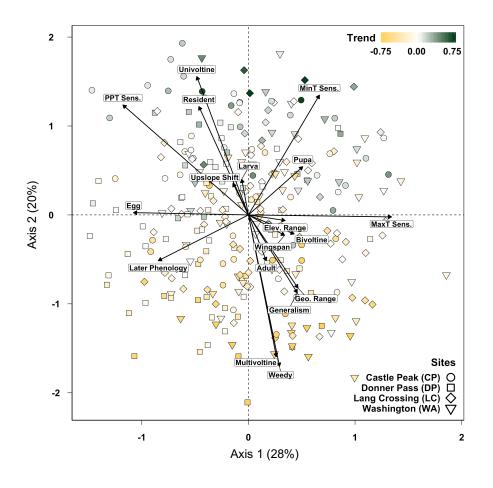
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Location	Source	Years	Species	Taxa	Method
Australia	Gibb et al. (58)	21	106	Ants	Pitfall traps
California, USA	Shapiro Transect (27, 41–43)	47	163	Butterflies	Modified Pollard walk
Colorado, USA	Iler et al. (59)	20	20	Hoverflies	Malaise traps
Costa Rica	Tritrophic Interaction Monitoring in the Americas (31)	22	1724	Lepidoptera, Parasitoids	Collect and rear
Ecuador	Grøtan et al. (53)	10	137	Butterflies	Fruit traps
Europe	Jourdan et al. (60)	32		Benthic invertebrates	Surface water survey
Finland	Finnish Moth Monitoring Scheme (61)	13	183	Moths	Light traps
Finland	Hunter et al. (23)	32	80	Moths	Light traps
Germany	Voight et al. (62)	20	1041	Arthropods	Pitfall trap, Sweep net
Germany	Krefeld Entomological Society (63)	27		Flying insects	Malaise traps
Germany	Baranov et al. (22)	42	125	Mayflies, stoneflies and caddisflies	Emergence trap
Great Britain	National Moth Recording Scheme (20)	40	673	Moths	Traps
Greenland	Koltz et al. (29)	18		Arthropods	Pitfall traps
Netherlands	Dutch Monitoring Scheme (33, 64)	18	40	Butterflies	Pollard walk
Netherlands	Hallmann et al. (65)	28		Beetles, Moths, Caddisflies	Pitfall traps
Russia	Chronicles of Nature (66)	40	19	Arthropods	Traps
Spain	Stewart et al. (67)	10	10	Butterflies	Pollard walk
United Kingdom	UK Butterfly Monitoring Scheme (32, 34, 54, 68–73)	45	55	Butterflies	Pollard walk
United Kingdom	Rothamsted Insect Survey (28, 32, 54, 74)	50	345	Aphids, Moths	Light trap
United Kingdom	Hoverfly Recording Scheme (75)	54	215	Hoverflies	Citizen observations

# Table 1. Monitoring studies of at least 10 insect species and at least 10 years from land use gradients or protected areas that have been used to examine weather in relation to insect populations.



**Fig. 1.** Overview of geography and major trends for Northern California case study. (*A*) Map of Northern California with focal sites, also shown in elevational profile in (*B*), with two-letter site abbreviations and the year when continuous sampling started at each site. (*C* and *D*) Standardized population indices (means across species by site) for mountain sites (*C*) and low elevation sites (*D*), with site colors the same as in (*B*). Inset density plots in (*C* and *D*) show the distribution of year coefficients across species in the two regions (high and low elevations), with vertical dotted lines marking zero, such that observations to the left of the line represent species with negative trends across time. (*E* - *G*) Histograms summarize changes in elevation between different nine-year windows of time; for example, panel (*E*) is the change in mean elevation per species between the earliest years (1977-1985) and years immediately before the mega-drought (2002-2010). Colors in histograms are for visualization with darker orange corresponding to more negative (downward) shifts and darker blue being more positive (upslope) shifts (see *SI Appendix*, Fig. S1 for additional details).



**Fig. 2**. Montane populations through time and population-specific properties that include life history traits and sensitivities to climatic variables, specifically precipitation (PPT Sens.), average daily maximum temperatures (MaxT Sens.) and average daily minimum temperatures (MinT Sens.). For example, populations in the upper portion of the ordination are characterized by positive responses to years that are wetter and have warmer minimum temperatures. Points are colored according to coefficients associated with years (i.e., "trend" or change through time), and those coefficients as well as climate sensitivities were estimated in separate Bayesian models. Each point in the ordination is a population (a species at a site), thus individual species are represented by between 1 and 4 points (depending on their presence at the four mountain sites). Life history traits include overwintering states, geographic range, phenology (average date of first flight), elevational range, elevational shift (as in Fig. 1 E-G), voltinism, body size (wingspan), breadth of habitat association (generalism), and weedy status (see main text and *SI Appendix* for more details). Percent of constrained variation explained is shown in parentheses after each axis label.