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Widespread decline of ground beetles in Germany

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Author contributions

SC, DB, HB, FJ, RK, MW, and AB conceptualised the idea and developed the method; SC and DB did the analysis; everyone contributed to the analysis; SC wrote the paper; everyone contributed to the writing.

35 **Abstract**

36 Many insect species are facing existential crises, primarily due to diverse human-induced activities. Most
37 insect assessments, however, are based on short-term data or some iconic species. Here, in close
38 collaboration with taxonomic experts from natural history societies, we compiled the best available
39 occurrence data for ground beetles in Germany, estimated the changes in species occupancy over the
40 last 36 years, and related these changes to the traits/characteristics of these species. We obtained
41 trends for 383 species and found that 52% of species significantly declined, and 22% significantly
42 increased in site occupancy. The remainder of the species (26%) all showed a mean negative trend,
43 albeit nonsignificant. Interestingly, non-threatened species declined at a similar rate to the threatened
44 species, with 64% of the Near Threatened species experiencing significant declines (highest among all
45 red list categories). Across all traits, we found that large (compared to medium) and omnivore
46 (compared to predator) species declined less. Considering that ground beetles are key predators in
47 many ecosystems and in agricultural systems that play an important role in pest control and in the food
48 chain, their decline should raise concerns. Thus, we urgently plead for more harmonised and systematic
49 monitoring of this insect group.

50 **Keywords**

51 Citizen science, insect decline, insect conservation, insect monitoring, long-term change, occupancy
52 detection model, trend analysis

53

54 **Introduction**

55 We are currently in the midst of a biodiversity crisis (Dirzo et al., 2014; Leclère et al., 2020). Human
56 activities, particularly habitat destruction and alteration, have caused a precipitous decline in many
57 species across various taxa (Butchart et al., 2010; Bellard et al., 2012; Haddad et al., 2015; Eichenberg et
58 al., 2021; Jandt et al., 2022). The Living Planet Report revealed a shocking 69% drop in the population
59 abundance of vertebrates over the last 49 years (WWF, 2022). However, such global reports often
60 overlook insects (Dove et al., 2023; Ledger et al., 2023). Despite the fact that insects are “the little things
61 that run the world” (Wilson, 1987), there are significantly fewer conservation assessments on insects
62 than on vertebrates (Chowdhury et al., 2023a; Samways et al., 2020). This disparity is also evident in
63 species extinction risk assessments: only 8% of the assessed species in the IUCN Red List are insects
64 (IUCN, 2024), even though insects comprise over 80% of animal species on Earth (Stork, 2018). The
65 massive underrepresentation of insects in the global extinction risk assessments is primarily due to
66 insufficient data on the occurrence of most species (Didham et al., 2020; Chowdhury et al., 2023b). For
67 example, about 65% of the species occurrence data in the Global Biodiversity Information Facility (GBIF)
68 are for birds, while less than 9% of the records are for insects (data accessed on June 9, 2024). Although
69 insect occurrence data have surged over the last one and half decades mostly due to citizen involvement
70 (Heberling et al., 2021), these new data are usually spatially and taxonomically biased and cannot be
71 compared to previous decades of specimen-based collections.

72 The loss of insect biodiversity has received much less attention than that of vertebrates, yet insect
73 decline is a global issue (Dirzo et al., 2014; Eisenhauer et al., 2019). Dunn (2005) estimated that if the
74 extinction rate of insects is similar to that of birds, nearly 44,000 insect species have already gone
75 extinct, yet only 70 insect extinctions have been documented. Recent studies have revealed that many
76 insect species are declining dramatically worldwide (Didham et al., 1996; van Klink et al., 2020, 2023;
77 Wagner, 2020; Wagner et al., 2021). For example, over 75% of insect biomass has declined in some
78 protected areas in Western Germany (Hallmann et al., 2017), over 80% of butterfly species have
79 declined in the Netherlands over the last century (van Strien et al., 2019), 29% of odonate species have
80 declined from 1980-2016 in Germany (Bowler et al., 2021). Although many threats are interactively
81 impacting species conservation status and trends, anthropogenic climate change and habitat change by
82 intensive agriculture are the main drivers of global insect declines (Dieker et al., 2011; Halsch et al.,
83 2021; Raven & Wagner, 2021; Outhwaite et al., 2022).

84 From all these underrepresented invertebrates, carabids are one of the most frequently sampled taxa
85 and are used in ecological studies about drivers and planning assessments (Rainio & Niemelä, 2003;
86 Avgin & Luff, 2010; Kotze et al., 2011). Carabids are often used as a bioindicator group. They play
87 important ecosystem functions, on the one hand as predator and biological control agents (Sharavari et
88 al., 2017), and on the other hand as prey for birds and small mammals. There is a good knowledge of
89 ecological requirements/niches of most of the prominent species (Rainio & Niemelä, 2003; Avgin & Luff,
90 2010; Kotze et al., 2011). Comparative studies have shown that large poorly dispersing specialist species
91 commonly decrease, while generalist good dispersers tend to increase (Kotze & O'Hara, 2003). In
92 Germany, the latest national Red List reported 35% of carabid species as either threatened or already
93 extinct (Schmidt et al., 2016). Some local studies assessed the trends of carabids in Germany: the species
94 richness and phylogenetic diversity, but not biomass, has declined in a forest over 24 years, (Homburg et
95 al., 2019). By assessing traits of the current Red List species of Germany, Nolte et al (2019) showed that
96 carabid species associated with mountainous, coastal and open habitats are at a higher risk of extinction
97 compared to most forest associated species. Here, by compiling carabid data using various approaches,
98 we analyse the long-term trends of carabid beetles in Germany for the past 36 years and assess if the
99 changes in occupied sites are related to species traits and national threatened status.

100 To meet the Kunming-Montreal global biodiversity framework targets (CBD, 2022), acting on insect
101 conservation is now a priority. Identifying the state of species, the pattern and reasons of decline is
102 crucial. However, estimating changes in species occupancy is aided by long-term systematic data, which
103 are unavailable from most of the world. Instead, there is a large amount of heterogeneous data,
104 collected either opportunistically or with unknown methods. If such data are analysed with naive
105 methods, there is the danger of producing biased estimates or having a low power to detect trends
106 (Isaac et al., 2014). While different types of statistical models exist to analyse population trends using
107 heterogeneous data, the occupancy detection model is the most reliable (Isaac et al., 2014; Outhwaite
108 et al., 2019; Bowler et al., 2022).

109 Based on almost 1 million records of occurrences of 554 species collected by German volunteers and
110 carabid experts, we assessed the changes in occupancy of carabid beetles in Germany over the last 36
111 years (1988-2023). Using single-species multi-season occupancy models (Doser et al., 2022), we

112 investigated the changes in occupancy patterns. We further collated species attributes to compare
113 whether changes in species occupancy were associated with conservation status or morphological and
114 ecological traits. This is the first-ever national-scale statistical assessment of carabid beetle trends in
115 Germany, highlighting the potential impact on policy and helping Germany meet the global biodiversity
116 framework obligations.

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119 **Methods**

120 *Occurrence data*

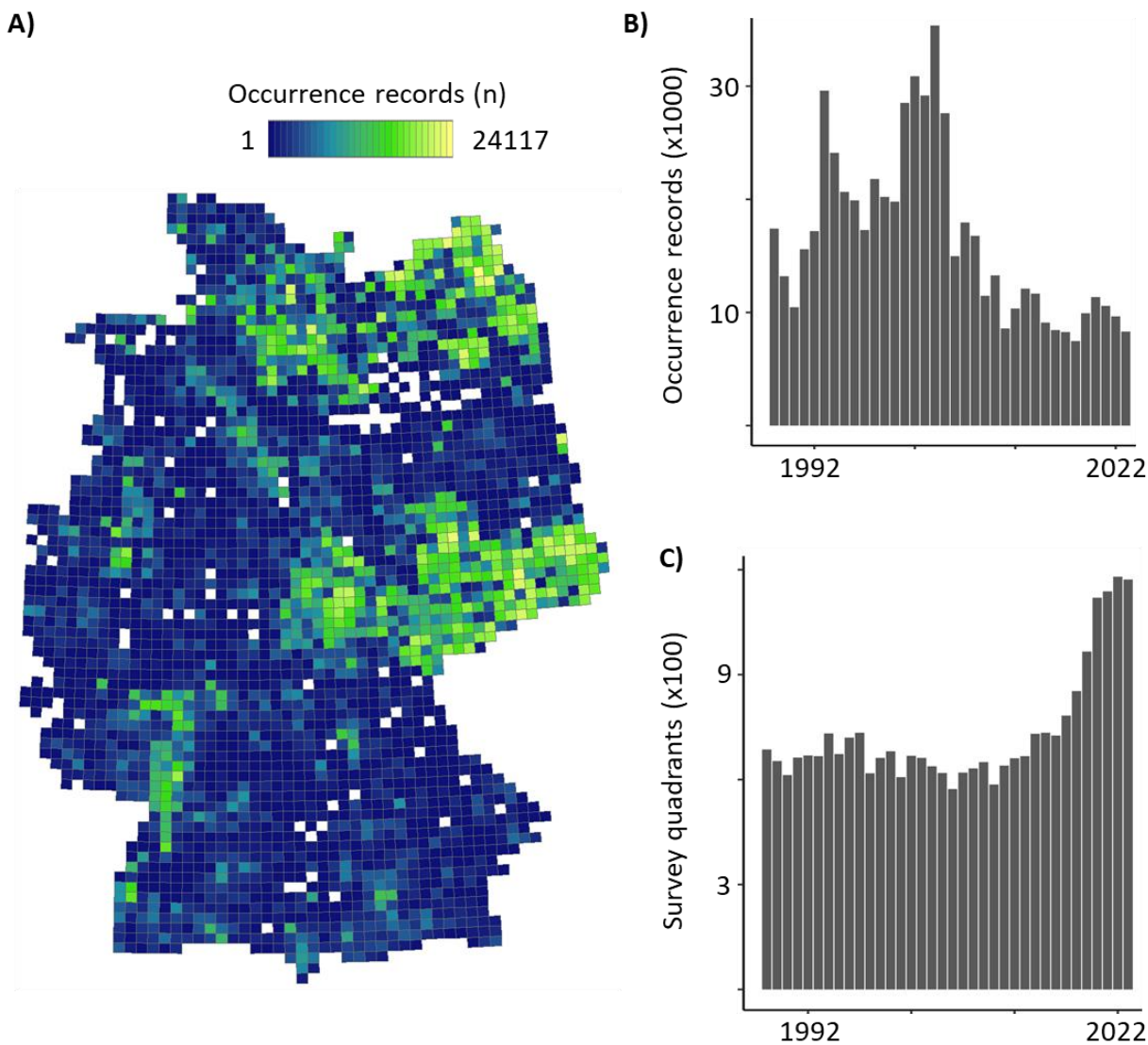
121 We collated species occurrence data in direct collaboration with German carabid experts. We compiled
122 the data in two steps. First, we obtained species occurrence data from the ColeoWeb
123 (<https://www.coleoweb.de/>) database (Bleich et al., 2024). This is the most comprehensive database for
124 German beetles, which includes data on carabid beetles that originate mostly from systematic pitfall
125 trapping, supplemented by data from hand collecting and opportunistic observations. This initial data
126 collation included 586,292 occurrence records for 554 species. Because this dataset did not contain the
127 most recent data that carabidologists have collected, we attended the annual meeting of the German
128 Carabid Society (GAC, <http://www.angewandte-carabidologie.de/>) in February 2024 in Göttingen. We
129 requested the members to share their unsubmitted observations within three months (by May 2024)
130 with the ColeoWeb database. This way, we updated the dataset to 953,230 occurrence records for 554
131 species.

132 *Data cleaning*

133 Once we obtained the compiled data, we cleaned the dataset following several approaches. First, we
134 harmonised species names and removed records without location information (longitude and latitude),
135 date (day, month and year), duplicate records, and imprecise coordinates (records in the ocean or
136 outside German borders).

137 We only included occurrence records for the last 36 years (from 1988 to 2023). We chose 1988 as the
138 first year because the occurrence records were substantially fewer in the earlier years. The yearly
139 species occurrence records were low for many species, so we grouped years into 2-year bins, resulting in
140 18 bins for the 36-year study period (1988-2023). After a peak in observations around the year 2000, the
141 number of observations has fallen again in recent years (Figure 1b). We grouped occurrence records into
142 survey quadrants with an edge length of 10 minutes longitude and 6 minutes latitude, which is
143 approximately 11 x 11 km (German Ordnance Map, Meßtischblatt, MTB). The number of survey
144 quadrants has increased over time (Figure 1c). We discussed this issue with the experts, who suggested
145 that this reflects a change in observer behaviour, with many observers now exploring new areas rather
146 than visiting the same sites. To estimate the changes in 2-year bins, we only included survey quadrants
147 visited at least twice in the last 36 years (Outhwaite et al., 2018; Bowler et al., 2022). Our final cleaned
148 dataset included 602,108 occurrence records for 554 species with a median of 346 occurrence records

149 per species (Figure 1a). The number of occurrence records was low for many species: 71 with < 10 and
150 173 with < 100; however, the occurrence records were well-distributed across the entire study period.
151 For example, we had data from 7 year-bins from at least 50% of the survey quadrants.



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153

154 **Figure 1.** The patterns of distribution records of carabid beetles in Germany (1988-2023). A) is the
155 spatial distribution of records for all species and years (colours reflect the number of records in each
156 MTB grid cell, where 'white' indicates no data from that grid); B) is the number of species occurrence
157 records per year; and C) is the number of survey quadrants per year with at least one species record.

158

159 *Trend estimation*

160 To estimate the changes in the occupancy of carabid beetles in Germany, we fitted single-species multi-
161 season occupancy detection models. Occupancy-detection models are one of the best methods to
162 estimate trends in heterogeneous occurrence data sources and are designed to accommodate variability
163 in detection probabilities (Isaac et al., 2014).

164 As the unit of the detection model, we aggregated observations into those likely to be collected on the
165 same survey visit. A visit was defined by species observations collected on the same date in the same
166 survey quadrant (van Strien et al., 2010; Bowler et al., 2022). We inferred the absences of species (non-
167 detections) based on observations of other species during a given visit (Outhwaite et al., 2020), similar
168 to the commonly used target-background method used in species distribution models (Ranc et al., 2017;
169 Barber et al., 2021). Since some sites were sampled much more than others, we subsampled at most 10
170 visits per year at any specific site (i.e., survey quadrant). We built models for species with at least 50
171 occurrence records (76% of species in the dataset).

172 We modelled occurrence probability as a function of site and year variation. Here, the year variation was
173 modelled by including the 2-year bins (due to data sparsity in some years) as a fixed continuous effect
174 and site variation as a random effect to account for mean spatial variation in occupancy. We modelled
175 the detection probability for each visit to a given quadrant in a 2-year bin. Survey effort was included in
176 the detection model using list length as a proxy variable: (Outhwaite et al., 2019). Specifically, list length
177 was the number of species reported on a visit (categorical variables with three levels: a single list (1
178 species, 53% visits), a short list (2–3 species, 21% visits) or a longer list (4 or more species, 26% visits, set
179 as the reference level). We separately fit the model for each species. The observed detection data for a
180 given species on each visit were assumed to be derived from a Bernoulli distribution conditional on the
181 presence of the species in that survey quadrant and a 2-year bin.

182 We fit the model using the spOccupancy package (Doser et al., 2022) in R (R Core Team 2024; Version
183 4.2.0) by Bayesian inference using Markov chain Monte Carlo simulation. We used vague priors and 3
184 chains with 150000 iterations, discarding the first three-quarters as burn-in. We assessed model
185 convergence using Rhat statistics and trace plots. We carried out posterior predictive checks by
186 calculating a Bayesian p-value with a Freeman-Turkey fit statistic. In the end, we obtained trends for 383
187 species (69% of 554 initial species). The model convergence/performance is good when the Rhat value is
188 < 1.1 , and the Bayesian p-value ranges between 0.1 and 0.9 (Doser et al., 2022). Based on this, the
189 model performance was sufficient in our case, with a mean Rhat value of 1.012 (median 1.007) and a
190 mean Bayesian p-value of 0.45 (median 0.45). Four German carabid experts also thoroughly examined
191 the predicted trends for each species to check for plausibility.

192 To test whether the survey bias had any impact on our result, we ran a sensitivity analysis. We removed
193 the two data-dense states (Mecklenburg-Vorpommern and Saxony) from the cleaned dataset and ran
194 the single-species multi-season occupancy model following the method described above. We discussed
195 the results in the results section and added the figure in the supplementary section (Supplementary
196 Figure S1).

197

198 *Species attributes*

199 To explain variation in the trends of different species, we collated two types of trait data. First, we
200 obtained the threat status of each carabid species from the German Red List (Schmidt et al., 2016).
201 Second, we combined species traits from the ColeoWeb database and Nolte et al. (2017). Specifically,
202 we collated species information on mean body size (numerical), wing types (categorical; short-winged,
203 dimorphic, and long-winged), trophic level (categorical; herbivore, mycetophag, omnivore, and
204 predator), and habitat preference (categorical: coastal, eurytopic, forest, mountain, open, riparian,
205 special habitat, and wetland). To test if the trend was significantly associated with any of the species
206 attributes, we fitted a linear model considering species trend with all attributes, calculated using the
207 occupancy-detection model, as the response variable and species attributes as the explanatory
208 variables.

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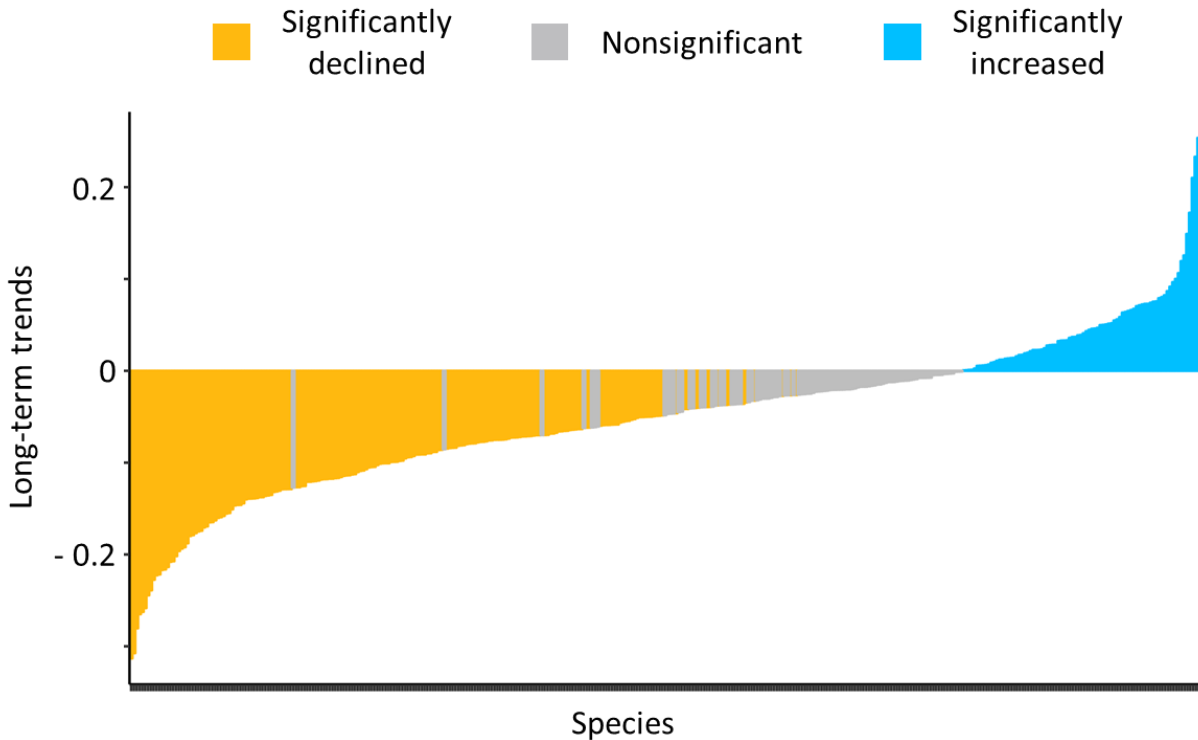
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211 **Results**

212 Of the 383 species, for which we obtained occupancy trends for (i.e., bi-annual changes in the number of
213 occupied survey quadrants), the trend was negative for 78% of species (298 species) and positive for
214 22% of species (85 species). Based on whether the 95% CI of trend overlapped zero, we identified that
215 52% of species (200 species) significantly declined, while 22% (85 species) significantly increased. The
216 trend was insignificant (or stable) for the other 26% of species (98 species) (Figure 2). We obtained a
217 very similar result ($|r| = 0.94$) in the sensitivity analysis, meaning that the survey bias did not have any
218 impact on our findings (Supplementary Figure S1).

219 For species that had significantly declined, the trend was highest for *Trechus pulchellus* (trend estimate:
220 -0.31; 95% CI = -0.46, -0.18). For species that had significantly increased, the trend was highest for
221 *Elaphropus diabrachys* (trend estimate: 0.25; 95% CI = 0.19, 0.33). The mean and median trend for the
222 significantly decreasing species was -0.1 and -0.09 respectively; while the median trend for the
223 significantly increasing species was 0.04. For 98 species, we obtained insignificant trends; all showed
224 slightly negative trends and were very close to zero (except for one species, *Stenolophus teutonius*;
225 trend: -0.13) (Figure 2).

226



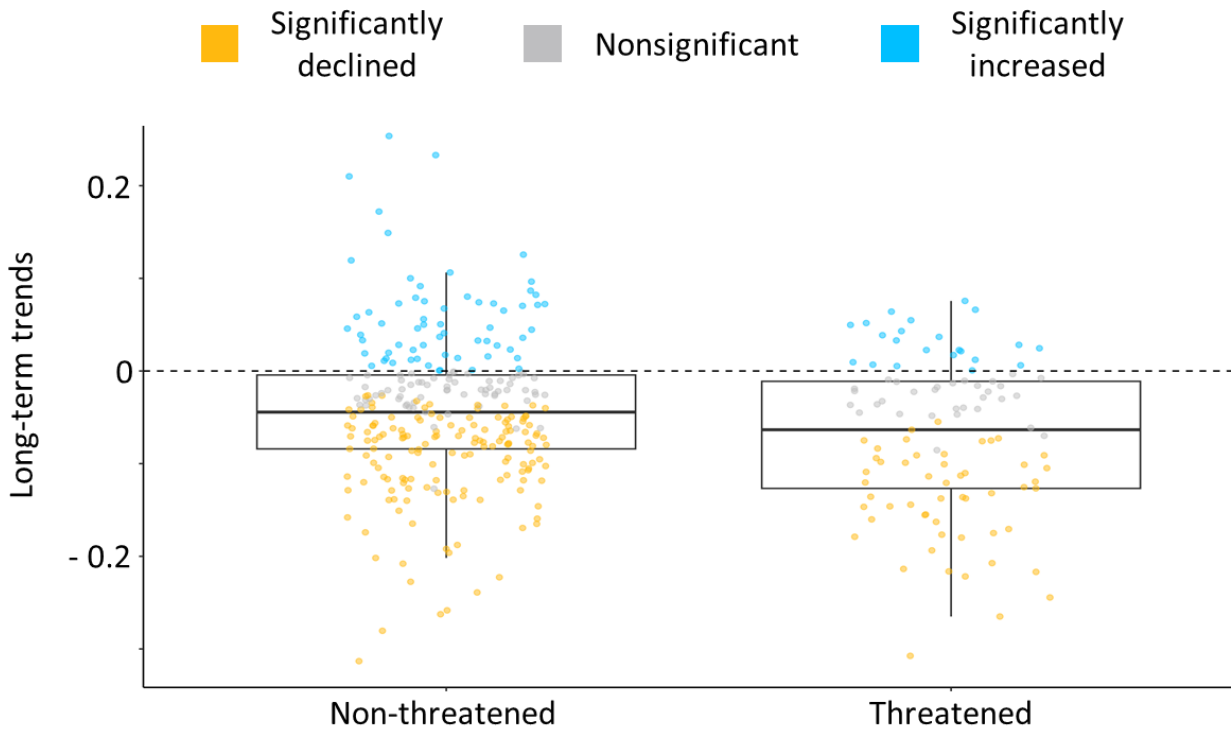
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228 **Figure 2.** The bi-annual changes in the number of occupied survey quadrants of carabid beetle
 229 occupancy in Germany over the last 36 years. Here, each bar represents one species.

230

231 The 383 species for which we could calculate trends contained 278 non-threatened species, 104
 232 threatened species, and only one species that was listed as Data Deficient in the German Red List
 233 (*Philorhizus quadrisignatus*). The overall changes in the proportion of occupied sites were somewhat
 234 similar among the threatened and non-threatened species. Of the 278 non-threatened species, 53%
 235 (148 species) significantly declined, 23% (63 species) significantly increased, and the trend was non-
 236 significant for 24% (67 species). In contrast, among the threatened species, 50% (52 species) significantly
 237 declined, 21% (22 species) significantly increased, and the trend was non-significant for 29% (30 species)
 238 (Figure 3). Among the species that had significantly declined over the last 36 years, the percentages
 239 were the highest for the Near Threatened species (64%; 32 of 50 species) and lowest for the Rare
 240 species (40%; 2 of 5 species). However, the association between the threatened and non-threatened
 241 species was non-significant (Estimate: -0.01, SE: 0.08, Z = -0.21, p = 0.83; generalised linear model).

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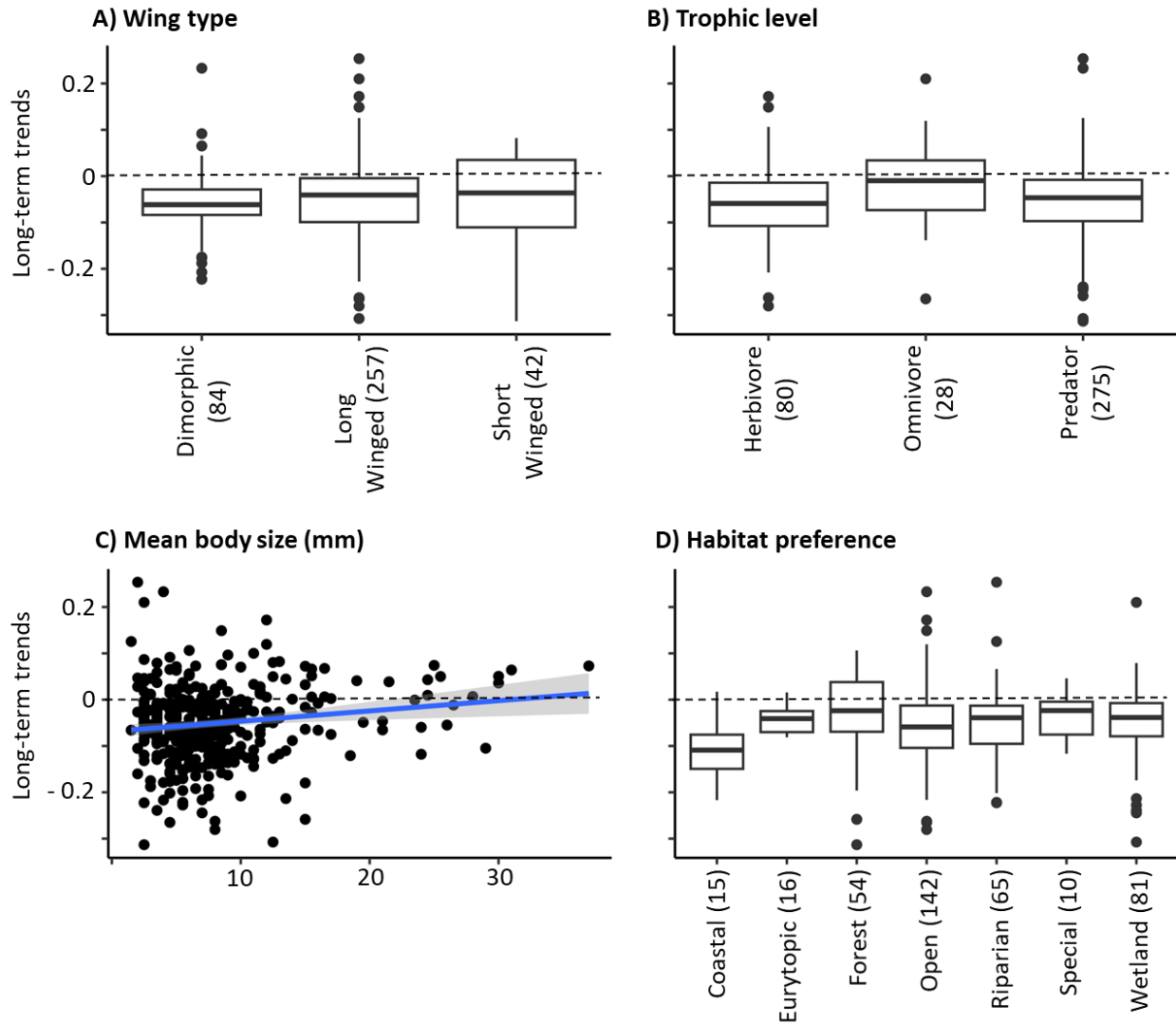


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244 **Figure 3.** Trends of German carabid beetles based on their national threat status. Each point shows a
 245 species, colours by its trend classification. The boxplot shows the median, interquartile range and range
 246 of the species trends. There was no significant difference between the trends of threatened and non-
 247 threatened species, albeit the trends were more negative for the former.

248

249 The median bi-annual changes in the proportion of occupied sites were somewhat similar across wing
 250 types (Figure 4A), whereas, for trophic level status, the median trend was slightly less declining among
 251 omnivorous species compared with herbivores (median trend: -0.02 vs -0.05) (Figure 4B). Beetle species
 252 with larger body sizes were more often associated with positive trends, whereas smaller species had
 253 slightly worse negative trends (Figure 4C). In contrast, regarding habitat preference, the species
 254 associated with coastal habitats showed the most negative trends (median trend -0.1), and forest-
 255 dwelling species were the least declining (median trend -0.03) (Figure 4D).



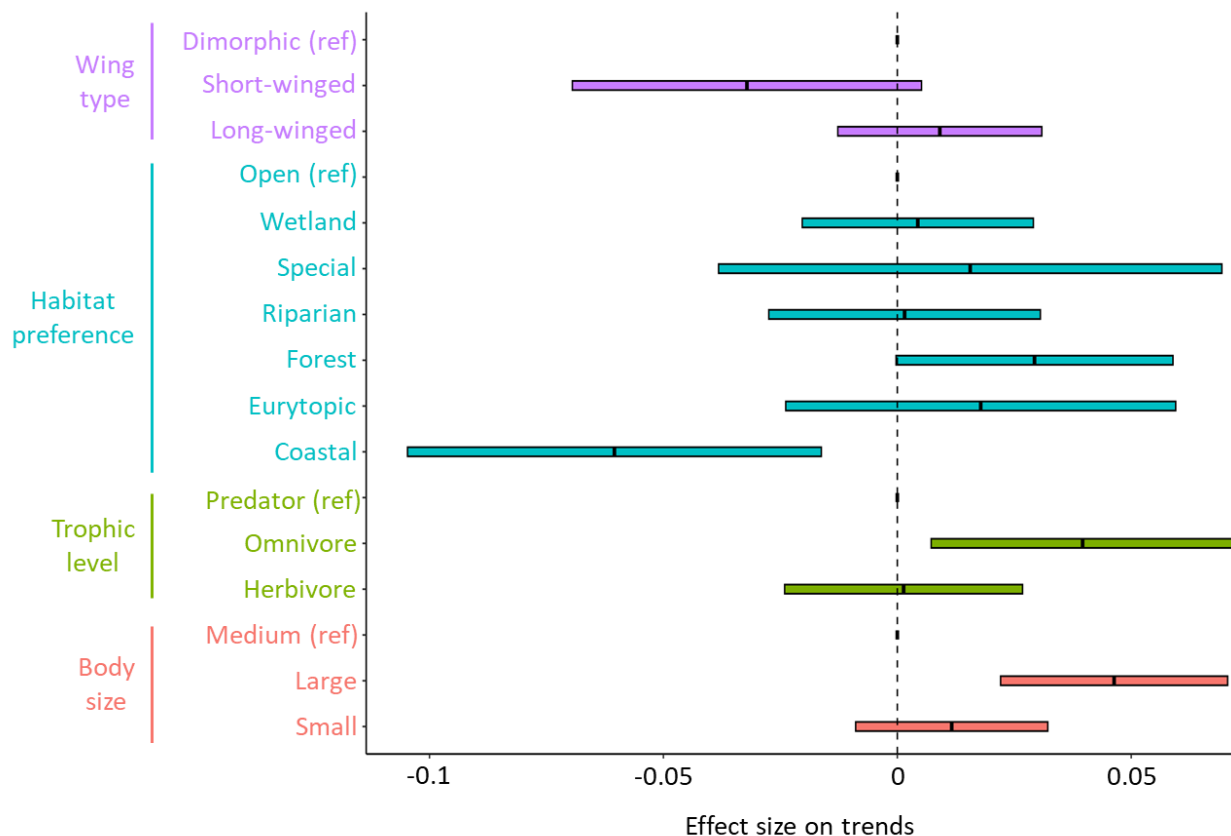
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257 **Figure 4.** Trends of German carabid beetles based on different morphological traits. A) shows the
 258 boxplots of the trends split by wing type; B) split by trophic level; C: by body size (each point shows a
 259 species) and D) split by habitat. Here, the horizontal dotted line in each plot indicates no changes.

260

261 While the short-winged species had a worse negative trend, the long-winged species had an increasing
 262 trend compared to the dimorphic species, but both were non-significant (Figure 5). In contrast to
 263 predatory species, both herbivore and omnivore species were increasing, but the association was only
 264 significant for the omnivore species (Estimate = 0.04, SE = 0.02, Z = 2.4, p = 0.02) (Figure 5). Among
 265 different habitat preferences, coastal species experienced significantly more negative trends (Estimate =
 266 -0.06, SE = 0.02, Z = -2.68, p = 0.008), while species with other habitat preferences experienced more
 267 positive but non-significantly different trends compared to the open-habitat species (Figure 5).
 268 Compared to medium-sized species, both small and large-bodied species had more positive trends, but

269 the difference was only significant for the large species (Estimate = 0.04, SE = 0.01, Z = 3.75, p = 0.0002)
 270 (Figure 5).



271
 272 **Figure 5.** Effect of species attributes on their long-term trend, where the reference groups were shown
 273 as points. We fitted a generalised linear model to calculate the effect size. Here, the effect size was
 274 assessed by comparison to the trends of reference groups (marked as *ref* in the y-axis, with dimorphic
 275 for wing types, predator for trophic level, medium for mean body size, and open habitats for habitat
 276 preference), selected by discussing with the carabid experts. For mean body size, we converted the
 277 continuous values to three categories: small (1.9-4.5 mm), medium (4.5-10.5 mm), and large (10.5-37
 278 mm).

279
 280 **Discussion**

281 Using the last 36 years (1988-2023) occurrence data of German carabid beetles, we show that nearly
 282 80% of the species have declined in occupancy, and the trend was significant for over half of them
 283 (52%). In contrast, only one-fourth of species have increased significantly. Our results of the declining
 284 trends are similar to the ones observed in several other insect taxa: 37% of butterflies, dragonflies, and
 285 orthopterans have declined in occupancy in Bavaria (Engelhardt et al., 2022), the insect biomass has
 286 declined by 10-60 times in Puerto Rico's Luquillo rainforest (Lister & Garcia, 2018), and 80% of the flies
 287 have declined in abundance in northeast Greenland (Loboda et al., 2017). Interestingly, our observed

288 changes in species occupancy are quite similar across national threat status classes. While the mean
289 trend of threatened species was slightly lower than the non-threatened species, the association was
290 non-significant. Among the non-threatened group, 64% of Near Threatened species have declined by a
291 mean amount of 8% of their occupied sites.

292 Species traits are widely considered an important factor in determining species' extinction risk, and
293 changes in species occupancy are associated with species attributes (e.g., Nolte et al., 2019). For
294 example, analysing carabid beetles from Belgium, the Netherlands, and Denmark, Kotze and O'Hara
295 (2003) showed that larger, habitat specialist, short-winged and long-winged species declined more
296 significantly than others. Dimorphic species are usually less prone to extinction because of their ability
297 to disperse (Turin & den Boer, 1988; Kotze & O'hara, 2003). We found that the median trends among
298 different wing types were similar; the trend was slightly better among omnivore species, smaller species
299 were more vulnerable, whereas, among the habitat types, coastal species were the most vulnerable,
300 whereas forest species were least vulnerable. This is in contrast to some of the previous studies where
301 the authors documented coastal and larger species were more vulnerable (e.g., Kotze & O'hara, 2003,
302 but see Nolte et al., 2019). Some authors documented that changes in habitat features, such as climate,
303 land use, and elevation, could have a significant impact on species trends (Desender et al., 2010; Purtauf
304 et al., 2005; Chamberlain et al., 2020; Liu et al., 2021; Skarbek et al., 2021). Future studies could analyse
305 the changes in spatial and temporal occupancy by considering climate, land cover and other features as
306 well as their changes and how species attributes modify their responses to these variables. For example,
307 the species living in forests are generally much larger than those living in dry grasslands. If forests are
308 not threatened at all, as this is the case in Central Europe, a positive trend in large-bodied species is
309 expected.

310 We followed a crowdsourcing approach to access more data, which increased the data by nearly 40%.
311 We also discussed our results with many carabid experts (some of whom are co-authors) to understand
312 if the bi-annual changes in occupancy matched their expectations and revised the analysis accordingly
313 (e.g., we removed very rare species from the analysis). Despite the various challenges with the data, the
314 trend estimates were broadly in line with the expectations of the experts. Our approach highlights the
315 value of data mobilisation, integration and community involvement for assessing species trends at large
316 scales. However, it should be noted that to be conservative, we only considered expert-verified data,
317 and we did not consider data from GBIF (see Heberling et al., 2021) or social media data (see Chowdhury
318 et al., 2023c, 2024) that may not have been expert validated but might further improve our assessment.
319 Additionally, the number of survey quadrants increased with time, reflecting the change in observer
320 behaviour, with many observers now exploring new areas rather than visiting the same sites. However,
321 occupancy detection models are well-equipped to handle such bias (Isaac et al., 2014; Outhwaite et al.,
322 2018). Our analysis is also limited by the lack of metadata to explain how individual data were collected
323 so we could not fully model the likely sampling variability. We used the list length as a proxy for
324 sampling effort, but this is an imperfect proxy since list length also depends on local species richness
325 (Outhwaite et al. 2018, Szabo et al. 2010). Nonetheless, as we noted above, our trend estimates passed
326 our expert assessment.

327 Insect decline is a widespread issue. Our study is another example that proves this point. Following
328 expert-driven data compilation and analysis, we show that most ground beetles in Germany have
329 severely declined over the last 36 years. Alarming, the number of non-threatened species is declining
330 at a rate similar to that of threatened species.

331

332 **Data and code availability statement**

333 The trend estimates, trait information and threatened status, are available in the online supplementary
334 material.

335 All the R scripts are available in the public GitHub repository
336 (https://anonymous.4open.science/r/occ_model_de-15DF/).

337

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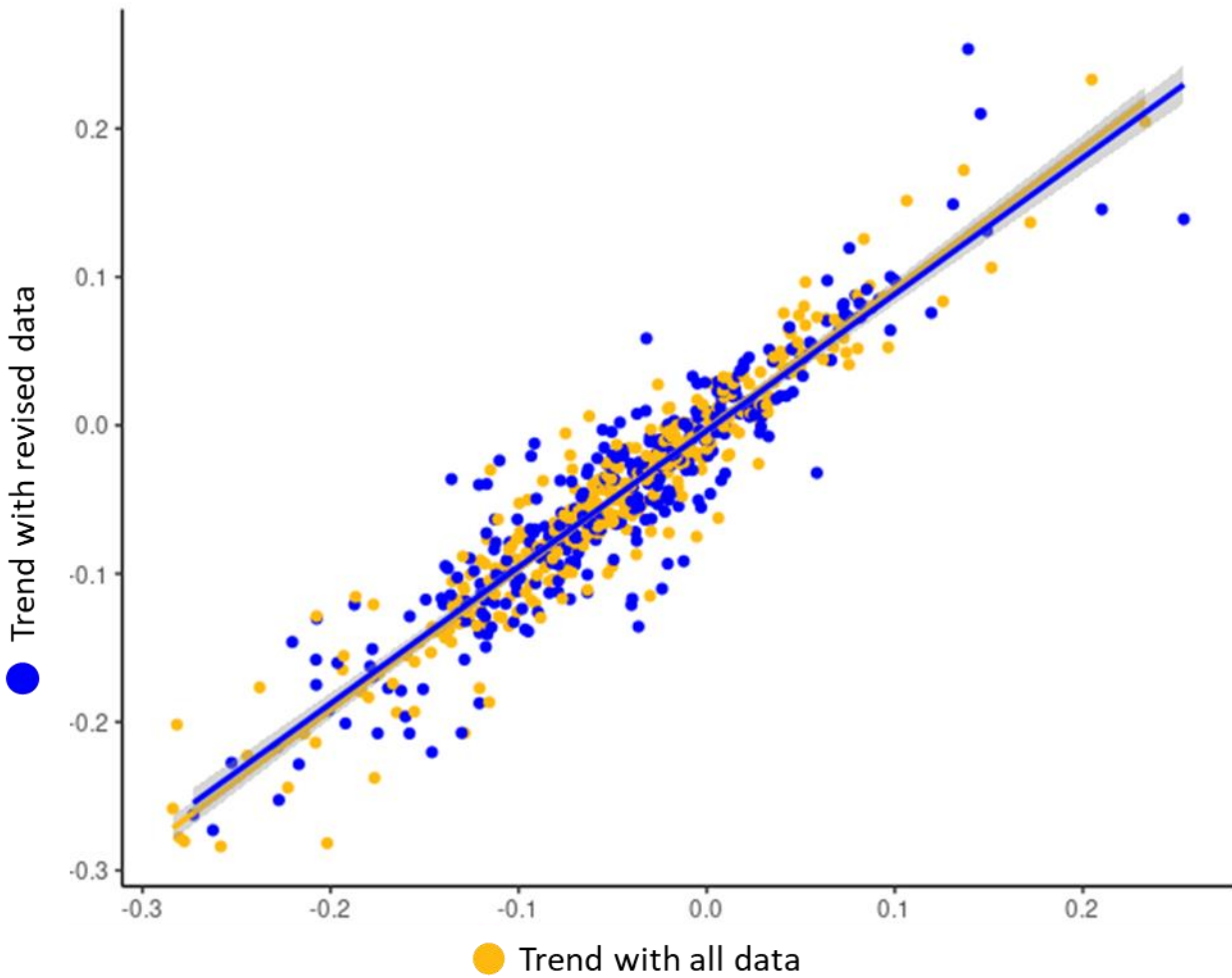
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Supplementary Figures

519 **Figure S1**

520 The association between trends with all data and the trends from the sensitivity analysis. The trends
521 from sensitivity analysis were obtained by removing two data-dense states (Mecklenburg-Vorpommern
522 and Saxony) from the cleaned dataset.



523