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# Strong trait correlation and phylogenetic signal in North American ground beetle (Carabidae) morphology

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**Abstract.** Functional traits mediate species' responses to, and roles within, their environment and are constrained by evolutionary history. While we have a strong understanding of trait evolution for macrotaxa such as birds and mammals, our understanding of invertebrates is comparatively limited. Here, we address this gap in North American beetles with a sample of ground beetles (Carabidae), leveraging a large-scale collection and digitization effort by the National Ecological Observatory Network (NEON). For 154 ground beetle species, we measured seven morphological traits, which we placed into a recently developed effect–response framework that characterizes traits by how they predict species' effects on their ecosystems or responses to environmental stressors. We then used cytochrome oxidase 1 sequences from the same specimens to generate a phylogeny and tested the evolutionary tempo and mode of the traits. We found strong phylogenetic signal in, and correlations among, ground beetle morphological traits. These results indicate that, for these species, beetle body shape trait evolution is constrained, and phylogenetic inertia is a stronger driver of beetle traits than (recent) environmental responses. Strong correlations among effect and response traits suggest that future environmental drivers are likely to affect both ecological composition and functioning in these beetles.

Key words: Carabidae; effect trait; functional trait; NEON; phylogeny; response trait.

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#### INTRODUCTION

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Functional traits mediate interactions between organisms and their environment (Violle et al. 2007) and therefore play a key role in our understanding of ecosystem functions, services, and environmental responses (McGill et al. 2006, Díaz et al. 2013). The general patterns of functional trait macro-evolution are remarkably variable, showing both strong evolutionary conservatism and lability, with consequences for subsequent ecological assembly (Webb et al. 2002, Ives and Godfray 2006, Cavender-Bares et al. 2009). For example, ecological selection on strongly conserved traits (where species resemble their close relatives; Pagel 1999, Wiens et al. 2010) naturally leads to ecological communities with reduced phylogenetic diversity. Such low-diversity communities are typically less productive and stable (but not always; see Tucker et al. 2017). The converse may be true for evolutionarily labile traits, particularly clades that have undergone adaptive radiations (Seehausen 2006) or convergence (Muschick et al. 2012). Yet, it is rare

for macro-evolutionary studies to contrast the evolutionary tempo and mode among traits driving ecological assembly and function (but see Díaz et al. 2013), and rarer still for non-plant taxa.

The effect-response framework has emerged within ecology as a powerful, if somewhat controversial (Savage et al. 2007, Luck et al. 2012), paradigm for understanding how the traits driving species' ecological assembly might be linked with their ecological functions (Díaz and Cabido 2001, Suding et al. 2008). Species' effect traits are associated with their ecological impact, including resource use, habitat modification, and contributions to nutrient cycling. Response traits, on the other hand, mediate how species are affected by their environments, including dispersal, colonization, and persistence within and across sites. While the effect-response dichotomy was conceptualized for plant species, and what delimits effect-response traits for invertebrates is often poorly understood, there are clear advantages to the paradigm. For example, they can be used to make predictions about species' responses to environmental stressors and potential for re-invasion following extirpation. The effect-response framework has thus gained traction in ecological risk assessment for predicting the consequences of environmental change for plant and arthropod species (Díaz and Cabido 2001, Wong et al. 2019). In such risk assessment, strong correlations among effect and response traits are of concern, because they imply that species lost due to environmental change (on the basis of response traits) will impact ecosystem function (via effect traits). Beyond current ecological uses, the evolutionary history of response traits can provide an informative context for how species and their traits respond across environmental gradients (Poff et al. 2006). Accordingly, effect-response trait-based risk assessment has been extended to consider phylogenetic patterns, both to predict species' effect and response traits, and to highlight where conserved trait evolution would suggest higher risk through correlation among traits (Díaz et al. 2013).

The phylogenetic extension of the effect–response framework has been primarily applied to plants and large vertebrates, leaving a conspicuous gap in our understanding of phylogenetic patterns of effect and response traits for invertebrates. This mirrors a broader limitation in our understanding of macro-evolutionary processes across systems due to taxonomic biases toward clades such as mammals, reptiles, and plants (Harmon et al. 2003, 2010, Eastman et al. 2011). Insects, particularly ground beetles (Carabidae), offer many species-rich and ecologically-important clades for investigating scale dependence in phylogenetic patterns. Clade-specific studies of phylogenetic signal in beetle functional traits have revealed a variety of patterns, such as variation in phylogenetic structure with trophic position, with predators being more constrained than detritivores (Fountain-Jones et al. 2017), and strong phylogenetic signal in body size-structured communities of diving beetles (Vamosi and Vamosi 2007). Also, while beetle lineage diversity appears to have been generated early in their history (Hunt et al. 2007), it is not clear whether this radiation of lineages matches a radiation of traits. Previous studies that have focused on beetle clades have revealed the interplay between the evolution of species' traits and their present-day ecology. This has included evolutionary conservatism of environmental tolerance (Hortal et al. 2011), habitat adaptations (Vamosi and Vamosi 2007), and environmentally filtered traits (Gossner et al. 2013). Understanding the role of beetle functional trait evolution in species assembly and ecosystem function is further warranted by the ecological importance of beetles as biological links between producers and consumers (Kotze et al. 2011), ecosystem engineers (Logan and Powell 2001, Albert et al. 2012), and high-impact pests (Bentz et al. 2010). Ground beetles (Carabidae) in particular are frequently used as indicator species due to their rapid responses to habitat fragmentation and degradation (Ribera et al. 2001, Rainio and Niemelä 2003), local-scale attraction to high-quality resources (Haila et al. 1994), and economically significant predation of agricultural pests (Hance et al. 1990, Collins et al. 2002). Exploring the links between beetles' response and effect traits would generate insight into ecosystem function under environmental change; incorporating phylogeny may allow prediction for the thousands of species about which we know comparatively little (Cardoso et al. 2011). With recent work explicitly placing beetle traits within the effect–response framework (Fountain-Jones et al. 2015, Moretti et al. 2017), it is both timely and worthwhile that we apply this

framework to understanding the evolutionary history and ecological consequences of beetle traits across North America.

We applied the effect-response trait framework to test the macro-evolution of functional traits for North American ground beetles. We quantified seven morphological traits from 1975 beetle specimens collected by the National Ecological Observation Network (NEON), and built a dated phylogeny from 2399 DNA sequences, using molecular data from the measured (and additional) specimens. For 154 species of ground beetle (representing approximately 6% of North American species and 30% of genera; estimated from Eaton and Garfield 2007, Anichtchenko 2021), we quantified the tempo and mode of beetle trait macro-evolution and tested whether trait evolution maps onto ecological function within the effect-response framework. The results of this analysis are intended to inform ecological risk assessment for North American beetles, and to provide an open-access data set for further exploration of beetles in the NEON field system.

#### MATERIALS AND METHODS

#### Effect–response framework and measurement

We selected traits for this study based on an existing literature review that characterizes wellstudied beetle traits into an effect–response framework (Fountain-Jones et al. 2015). We note that how traits affect ecosystem services is poorly understood for beetles, and arthropods in general (Fountain-Jones et al. 2015, Wong et al. 2019). We chose seven morphological traits that were possible to accurately assess from images of specimens and that were previously classified as effect and/or response traits (Table 1).

We measured the seven target morphological traits using dorsal images of ground beetle specimens (one image per specimen) provided by NEON. The specimens were sampled using pitfall traps across NEON's terrestrial North American field sites (Hoekman et al. 2017, NEON 2018). The samples used in this study were collected from 32 terrestrial NEON field sites ranging from the southeastern United States (e.g., the Disney Wilderness Preserve site, mean annual temperature: 22°C) to the Alaskan tundra (e.g., the Toolik site, mean annual temperature:  $-4^{\circ}$ C). These sites represent a wide range of environmental conditions across U.S. regions including the Southeast, Ozarks Complex, desert Southwest, Southern Plains, Appalachians, Southern Rockies, Mid-Atlantic, Northern and Central Plains, Northeast, Pacific Northwest, Great Lakes, and Taiga. Traps were visited biweekly throughout the growing season. We measured traits using the program Fiji (Schindelin et al. 2012), standardizing the images with a 5-mm scale to account for variation among photographs, and recording all traits at the

Table 1. Classification of seven morphological ground beetle traits in the effect–response trait framework.

Trait	Ecological function	Notes				
Body length	fecundity; foraging capability; dispersal	Increased body size may increase nutrient cycling (larger species consume more, Schmitz 2017, and can disperse further) (E). Larger carabids are sensitive to disturbance and more common in more forested landscapes (Vandewalle et al. 2010, Spake et al. 2016) (R)				
Abdomen length	microhabitat use	More robust species can occupy denser leaf litter habitats (Barton et al. 2011) (R)				
Abdomen width	microhabitat use	More robust species can occupy denser leaf litter habitats (Barton et al. 2011) (R)				
Pronotum width	microhabitat use	More robust species can occupy denser leaf litter habitats (Barton et al. 2011) (R)				
Head length	resource use	Larger head sizes can increase consumption efficiency (Thompson 1992) (E)				
Head width	microhabitat use; resource use	More robust species can occupy denser leaf litter habitats (Barton et al. 2011). Larger head sizes can increase consumption efficiency (Thompson, 1992) (E)				
Antenna length	habitat preference	Larger antennae can support larger numbers of sensilla allowing better sensory performance (Elgar et al. 2018). Carabids with longer antennae prefer open microhabitats (Barton et al. 2011) and more forested regions (Vandewalle et al. 2010) (R)				

*Notes:* For each trait, we identify an associated ecological function, and whether the trait is linked to a species' *effect on* (E) or *response to* (R) its environment, based on classifications from Fountain-Jones et al. (2015). Different traits can map onto the same ecological function, and a trait can be both an effect and a response trait.

R: putative response trait, E: putative effect trait.

maximum possible length or width for each feature. This resulted in 13,825 observations from 1975 specimens. Species identifications were performed by NEON taxonomists. For each species, we calculated median trait values (mean = 12 individuals per species) for use in subsequent analysis. Information regarding beetle sex was not recorded. We included 154 species in all trait analyses, and we note that 12 of what we refer to as "species" throughout are in fact morphospecies, often only identified to the genus level. We have included those groups in our analyses because sequences provided from the specimens allowed us to place them in the phylogeny.

All trait measurements were made by a single observer, using a protocol generated as part of this study (Appendix S1). A major advantage of our data set is that each specimen was identified and DNA-sequenced (see Phylogeny construction), giving a high degree of taxonomic precision and reproducibility to our analysis. Our protocol was, however, designed around the limitation that the only images we had of the beetles were dorsal views, which imposes limitations on the measurements we were able to make. While these measurements are therefore limited, we feel the comprehensive coverage of this data set in terms of geography, taxonomy, and genetic data gives us a unique opportunity to examine the morphology of these beetles.

#### Phylogeny construction

NEON has released cytochrome oxidase 1 (COX1, the barcoding region for beetles) sequences for all of the specimens digitized and measured in this study and some additional specimens (Hebert et al. 2003). We used these sequences to generate a phylogeny of our species (along with five outgroup sequences from Myrmeleon immaculatus, Myrmeleon formicarius, Brachynemurus abdominalis, Brachynemurus ferox, and Dendroleon obsoletus). We aligned these sequences using MAFFT (Katoh 2002) and then performed 1000 independent maximumlikelihood searches using RAxML under a GTR-GAMMA model (using a re-arrangement "i" parameter of 10, chosen through likelihood comparisons as outlined in the RAxML manual; Stamatakis 2014). The most-likely tree was then dated using treePL (Smith and O'Meara 2012),

with the smoothing parameter estimated using cross-validation, using a date range of 290– 310 mya for the outgroup (Zhang et al. 2018). This single, dated phylogeny was then used for all downstream analysis. We emphasize that this phylogeny, which was built using a single locus, should not be viewed as a definitive phylogeny for North American beetles; while we have excellent taxonomic coverage (i.e., species collected from across North America), that is not matched by genetic coverage (i.e., a single barcoding region). Our goal with this phylogeny (which is, itself, a hypothesis) is to use it as a tool to test a series of questions about the tempo and mode of ground beetle morphological evolution.

#### Modeling the evolution of individual traits

The last few years have seen an explosion in so-called "phylogenetic comparative methods," which can be used to test hypotheses and questions about the tempo (speed) and mode (kind) of trait evolution (reviewed in Cooper et al. 2010). While our ultimate goal is to understand how beetle morphology may have evolved, and to use the effect-response framework to consider the consequences of such evolution on ecological function, we begin by verifying our underlying data using classic comparative methods. We therefore begin by fitting explicit statistical models to test the most likely kind (mode) of trait evolution, using information theoretic criteria (AIC) to assess models' fit while accounting for their different degrees of complexity (Boettiger et al. 2012). Our first model is a "white noise" (null) model that tests whether there is any association between each trait and our estimated phylogeny; since beetle morphology has been used for centuries to assign taxonomy (and that taxonomy broadly maps onto phylogeny), strong support for this model would suggest our phylogeny is inaccurate. Thus, this first model test is critical to verifying our approach. We then estimated the fit of Pagel's  $\lambda$  and  $\delta$  (Pagel 1999) to these data;  $\lambda$  measures the extent to which the data are consistent with a Brownian motion (BM) model of evolution (a  $\lambda$  of 0 indicating no fit, and 1 indicating pure BM), and  $\delta$  the extent to which the data fit a model of accelerating or decelerating evolution ( $\delta < 1$  indicating decelerating, and  $\delta > 1$  indicating accelerating). These transformations are notable for being relatively sensitive to

the presence of any phylogenetic signal (the tendency for closely related species to resemble one another) and to be able to assess the magnitude of that resemblance (Münkemüller et al. 2012). We fit pure models of Brownian Motion evolution (consistent with inherited, non-directional trait evolution and comparable with Pagel's  $\lambda$ ; see Revell et al. 2008 for further discussion), trends in increasing or decreasing rates of evolution through time (to be compared with Pagel's  $\delta$ ), which represent the special cases of Pagel's  $\lambda$ and Pagel's  $\delta$ , respectively, where there is perfect signal. Finally, we fit a single-optimum Ornstein-Uhlenbeck model (Butler and King 2004), which is broadly thought to test for clade-level trait optima (Uyeda and Harmon 2014). All models were fit using geiger (Harmon et al. 2008).

#### Modeling the coevolution of traits

Species traits rarely, if ever, evolve independently, and to test for broad patterns in, and the evolution of, beetle allometric relationships, we conducted a phylogenetic principal component analysis (phylogenetic PCA; Revell 2009). A "standard" PCA identifies the major axes of variation within a data set of continuous traits, identifying how multiple variables (in this case traits) are correlated with one another. So, for example, if beetles with longer legs tended also to have longer and narrower carapaces, then a PCA might detect and represent this pattern by having an axis with strong positive loadings (essentially correlations) with leg and carapace length, and a negative loading with carapace width. A phylogenetic PCA is analogous, but differs in accounting for how species' shared evolutionary history makes them nonindependent observations (similar to methods reviewed in Cooper et al. 2010). This allows us to account for and measure the degree to which observed associations are likely the result of shared, inherited trait variation. The resulting principal component analysis axes can be analyzed analogously to "standard" PCA axes, but we additionally have a measure of phylogenetic signal—Pagel's  $\lambda$ —that is interpreted exactly as it is when applied to univariate data (see Modelling the evolution of individual traits).

#### Results

Among our 154 species (from 50 genera), the traits with the greatest variation were body length (SD = 5.60, ranging from *Elaphropus anceps*, 2.43 mm, to Pasimachus strenuus, 28.16 mm) and abdomen length (SD = 3.43). The trait that varied the least among species was head length (SD = 1.37). We found strong evidence of phylogenetic signal (all  $\lambda > 0.73$ ; all P < 0.001) in all traits measured (Table 2), providing evidence that our phylogeny (despite the limitations outlined in the methods) is sufficient to detect pattern and process in trait macro-evolution. Pagel's  $\lambda$  models best explained beetle body shape trait evolution based on AIC scores for all seven traits (Table 2). Strong support for Pagel's  $\lambda$  is consistent with trait evolution intermediate between pure chance and pure Brownian motion, that is, phylogenetic signal. Phylogenetic PCA further revealed that all measured body shape traits are

Table 2. Measure of phylogenetic signal (Pagel's  $\lambda$ ; for all traits, P < 0.001), and AIC weights for seven evolutionary models, for each of seven morphological ground beetle traits.

Trait	Pagel's λ	BM	OU	EB	TR	λ	δ	WN
Body length	0.82	1204.0	967.0	1206.0	1160.4	892.4	1127.2	970.4
Abdomen length	0.86	1015.5	815.5	1017.5	974.0	742.2	943.4	819.7
Abdomen width	0.81	939.4	689.1	941.4	895.0	617.5	860.9	694.0
Pronotum width	0.76	952.2	659.0	954.2	906.0	578.4	869.8	661.4
Head length	0.75	647.8	375.6	649.8	602.9	317.9	568.1	377.6
Head width	0.74	785.0	534.2	787.0	739.7	453.3	704.5	536.7
Antenna length	0.88	775.3	670.3	777.3	742.6	614.1	721.6	683.3

*Notes:* Models include Brownian motion (BM), Ornstein-Uhlenbeck (OU), early burst (EB), trend through time (TR), Pagel's  $\lambda$ , Pagel's  $\delta$ , and white noise (WN). In all traits, Pagel's  $\lambda$  values were >0.73 and Pagel's  $\lambda$  was the most-likely model (i.e., had the lowest AIC;  $\delta$ AIC > 56.1). Strong support for Pagel's  $\lambda$  is consistent with trait evolution intermediate between pure chance and pure Brownian motion, that is, phylogenetic signal.

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highly correlated regardless of classification as an effect or response trait (Fig. 1; Appendix S2). PC1 accounted for 86.1% of the component variance, while PC2 accounted for an additional 7.2%. Thus, in these data, all beetle effect and response were both highly correlated and showed phylogenetic signal ( $\lambda = 0.67$ ).

#### Discussion

We found evidence of phylogenetic signal in all ground beetle traits measured, and our AICbased theoretic model comparison best supported Pagel's  $\lambda$  for all seven traits. These results indicate that these North American ground beetles' morphologies are evolutionarily conserved, and phylogenetic inertia is a stronger driver of trait evolution than lineages' recent or independent responses to ecological disturbances and interactions (Cooper et al. 2010). Furthermore, phylogenetic PCA revealed that all measured body shape traits, both within and across the effect and response categories, are highly correlated. The  $\lambda$  value of the PCA reinforced our finding of strong phylogenetic signal in individual beetle traits, consistent (again) with conserved trait evolution along the principal component analysis axes. Together, these results pose a conservation concern: the correlation between beetle effect and response traits suggests that a severe disturbance event may lead to a decline in ecosystem services (Díaz et al. 2013),

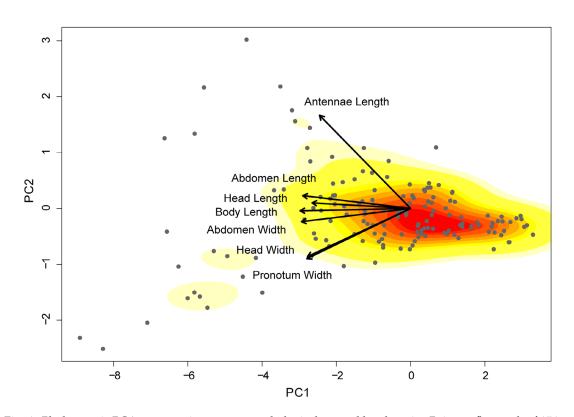


Fig. 1. Phylogenetic PCA representing seven morphological ground beetle traits. Points reflect each of 154 species, and arrows represent the loadings of the morphological traits. Background color shading indicates the density of points within the space. PC1 represents 86.1% of the total variance among traits, and PC2 represents an additional 7.2% (full summary and loadings in Appendix S2). Head and body length, and abdomen length and width all load strongly onto PC1, while PC2 captures additional variation in pronotum and head width and antenna length. There is a strong correlation among all traits, including effect traits (head length, body length) and response traits (all traits).

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and shared traits among closely related species increase the risk of disturbance leading to the loss of entire clades.

# Evolutionary constraints on ground beetle morphology

The strong phylogenetic signal (all traits'  $\lambda > 0.73$ ) we identified across seven morphological ground beetle traits is consistent with the findings of previous studies, which have found evidence of phylogenetic signal in traits for mammals (Arnaudo et al. 2019), trees (Swenson et al. 2017), and even habitat-specialized beetle clades (Vamosi and Vamosi 2007). In these other studies, and ours, links between phylogenetic structure in traits and key ecological processes suggest that traits were evolved early in species' evolutionary history and helped define clades' relationships with their environments. Researchers have also found evidence that beetle assemblages are phylogenetically clustered (e.g., Funk et al. 1995) and that predator-prey relationships in ground beetle assemblages are conserved (Brousseau et al. 2018). This further highlights the importance of considering phylogenetic constraint in predictions of how environmental change might lead to the loss of beetle diversity and associated ecological functions.

We note that, while our study has broad spatial coverage (much of the United States of America), our taxonomic sampling is biased. Pitfall traps were used to collect these specimens and have been shown to filter traits in other insect taxa (Lee and Guénard 2019); our beetles are ecologically similar and thus a non-random subset of all North American species. Other studies attempting to apply phylogenetic risk assessment are likely to encounter similar biases, and so we urge caution in uncritically applying our results, and those of similarly biased samples, to broader macroevolutionary contexts. That said, such studies represent valuable pieces in the macro-evolutionary puzzle, and our study contributes new cladespecific information to our growing knowledge of beetle evolution as a whole. Testing the taxonomic and geographic scale dependence of phylogenetic signal in body traits across beetle families is an important next step, but requires a complete phylogeny and is therefore outside of the scope of the present study.

#### Correlation among functional traits

The effect-response trait framework provides an opportunity to investigate ecological responses to environmental change using functional traits as a proxy for how organisms affect and are affected by their environments (Suding et al. 2008). Phylogenetic signal in effect or response traits, as we found in this study, may represent an increased risk that environmental stressors will lead to the loss of multiple closely related beetles from an ecosystem (Díaz et al. 2013). In addition to the risk associated with conserved evolution of these traits, the strong correlations among traits demonstrated by our phylogenetic PCA suggest further ecosystem risk. When effect and response traits are linked, as in our results, the loss of traits associated with environmental change is more likely to result in the loss of traits linked to particular ecological functions. We note that the extinction (or extirpation) of species and the loss of their associated traits rely on the assumption that selection pressures act on response traits; however, this link between response traits and the loss of species has yet to be demonstrated empirically. For instance, links between drought pressure and the loss of species with dispersal-limiting traits could be tested using experimental approaches, extinction analyses, or simulations.

Despite the novelty of applying the effect-response trait framework to beetles (Fountain-Jones et al. 2015) and, in particular, the need for more experimental research to identify and investigate effect traits (Wong et al. 2019), the correlation among all traits measured suggests ecological response and function are broadly linked. Seemingly small changes in a species' environment could therefore lead to changes in community structure and function (Mayer and Rietkerk 2004, Groffman et al. 2006). For North American beetles, this loss of function could result in increased harmful pathogen presence, aphid predation on crops, fire-interval variability, loss of biodiversity, or a loss of key habitat health indicators (Logan and Powell 2001, Rainio and Niemelä 2003). Understanding evolutionary constraints on and correlations among other ecologically important traits, such as those associated with beetle behavior and adaptive responses to environmental change, are important topics for future research. Our list of morphological traits was constrained by what is practical to extract consistently from

dorsal images. Including sensory traits (such as eye size) and traits related to mobility (such as leg length and wing characteristics) which are difficult to measure from dorsal images is likely to further capture ecological differences between ground beetle species (Fountain-Jones et al. 2017). Moreover, while difficult to collect, traits more directly quantifying beetle fitness and energy constraints, such as average number of offspring and metabolic rate, are crucial for further understanding the effect-response trait continuum. For the many ecosystems reliant on services provided by ground beetles, this effect-response framework provides a useful insight for conservation practitioners: saving species will matter. Those species that are most likely to be lost are providing different ecosystem services from those that are left behind, and so preserving natural beetle assemblages is worthwhile if beetle ecosystem services are a priority.

In conclusion, we find evidence of strong phylogenetic signal in the North American ground beetle traits we measured, suggesting the evolution of these traits is constrained by phylogenetic inertia. While our data set is expansive (covering 154 species), it does not reflect all Carabidae (or even all of those found within North America). These results provide a unique contribution to our understanding of evolutionary conservatism across phylogenetic scales, as well as the past and future of ecological assembly in this particular clade. The strong correlation among effect and response traits in this study implies that local extinction events could lead to a loss of ecosystem services. Resource managers who want to preserve ecosystem function in the face of global change should therefore attempt to preserve beetle assemblages as a whole. We hope that the data we release with this manuscript will be of use in future studies examining drivers of beetle cooccurrence, invasion and dispersal success, and the controls on beetle range limits. We call for further work to examine whether species' effect and response traits can be distinguished among beetle taxa, particularly in studies examining a more ecologically and taxonomically broad set of species.

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### DATA AVAILABILITY

All data and R code are available from Open Science Framework: https://osf.io/grvz2/.

## SUPPORTING INFORMATION

Additional Supporting Information may be found online at: http://onlinelibrary.wiley.com/doi/10.1002/ecs2. 3832/full