

**Linking macro-trends and micro-rates:  
re-evaluating micro-evolutionary support for Cope's rule**

Kiyoko M. Gotanda<sup>1\*</sup>, Cristián Correa<sup>2,3</sup>, Martin M. Turcotte<sup>4</sup>, Gregor Rolshausen<sup>1</sup>, and Andrew P. Hendry<sup>1</sup>

<sup>1</sup> Redpath Museum and Department of Biology, McGill University, Montreal, Quebec H3A 1Y1

<sup>2</sup> Instituto de Conservación Biodiversidad y Territorio, Facultad de Ciencias Forestales y Recursos Naturales, Universidad Austral de Chile, Valdivia

<sup>3</sup> Instituto de Ciencias Marinas y Limnológicas, Facultad de Ciencias, Universidad Austral de Chile, Valdivia

<sup>4</sup> Institute of Integrative Biology, ETH Zürich, Universitätsstrasse 16, Zürich, 8092, Switzerland

Short title: Evolutionary rates and Cope's rule

Corresponding author email: kiyoko.gotanda@mail.mcgill.ca

Figure: 2; Tables: 2; Word Count: 4,126

Data will be archived in Supplemental Materials

## Abstract

Cope's rule, wherein a lineage increases in body size through time, was originally motivated by macro-evolutionary patterns observed in the fossil record. More recently, some authors have argued that evidence exists for generally positive selection on individual body size in contemporary populations, providing a micro-evolutionary mechanism for Cope's rule. If larger body size confers individual fitness advantages as the selection estimates suggest, thereby explaining Cope's rule, then body size should increase over micro-evolutionary time scales. We test this corollary by assembling a large database of studies reporting changes in phenotypic body size through time in contemporary populations, as well as studies reporting average breeding values for body size through time. Trends in body size were quite variable with an absence of any general trend, and many populations trended toward smaller body sizes. Although selection estimates appear to support Cope's rule, our results suggest that actual rates of phenotypic change for body size do not. We discuss potential reasons for this discrepancy and its implications for the understanding of Cope's rule.

Keywords: body size, breeding values, Darwins, Haldanes, contemporary evolution, rates of evolution

## 19 **Introduction**

20 Body size influences most aspects of an organism's biology, including its physiology,  
21 morphology, life history, and biochemistry (Peters 1983; Calder 1984; Bonner 1988; LaBarbera  
22 1989; Purvis and Orme 2005; Kingsolver and Huey 2008). Body size is also an important  
23 determinant of the ecological niche and its impact on other organisms (Stanley 1979; Peters  
24 1983). As a result, body size evolution has been the focus of intense historical and contemporary  
25 interest (Peters 1983; Calder 1984; Bonner 2006; Cooper and Purvis 2010). A common  
26 perception in this work is that body size is generally under positive selection for a variety of  
27 individual fitness-enhancing reasons. For instance, larger size often enhances performance (e.g.  
28 physiological and locomotory), social dominance, tolerance to stress, predator avoidance,  
29 foraging ability, fecundity, and mating success (Peters 1983; Brown and Maurer 1986;  
30 Blanckenhorn 2000; Hone and Benton 2005; Bonner 2006; Kingsolver and Huey 2008; Herczeg  
31 et al. 2010). Such selection is predicted to cause the evolution of increasing body size through  
32 time (Brown and Maurer 1986; Bonner 1988). Indeed, such a trend has been reported in a  
33 number of fossil series, most famously by Edward Drinker Cope (Cope 1885, 1896). The  
34 observed phyletic pattern has come to be known as 'Cope's rule' (Rensch 1948; Stanley 1973),  
35 and it has received support from studies of invertebrates (e.g. Hallam 1975; Novack-Gottshall  
36 2008; Chown and Gaston 2010; Lamsdell and Braddy 2010), plants (Chaloner and Sheerin  
37 1979), and vertebrates (e.g. Alroy 1998; Hone and Benton 2005; Lamsdell and Braddy 2010).

38         Despite the above arguments many organisms remain small, which suggests constraints  
39 or opposing selective forces (Blanckenhorn 2000; Purvis and Orme 2005; Kingsolver and  
40 Pfennig 2007). At the individual level, attaining larger size can require faster growth, which can  
41 lead to increased foraging risk and therefore higher mortality (Dibattista et al. 2007; Carlson et

al. 2008). In addition, faster growth can lead to structure problems (Arendt 1997; Arendt and Wilson 1999) and reduced locomotory performance that can increase predation risk (Lankford et al. 2001). Furthermore, at the macro-evolutionary level, there can be advantages to being smaller such as increased potential for adaptive evolution (Bromham et al. 1996; Dombroskie and Aarssen 2010). These reasons might explain why different studies have found either no change or a decrease in body size through time (Jablonski 1997; Alberdi et al. 1998; Knouft and Page 2003; Moen 2006; Churchill et al. 2014).

If Cope's rule is driven by individual large-size fitness benefits, the signatures of this mechanism should be evident on micro-evolutionary time scales. With this idea in mind, a few studies have tested the logical corollary that selection on body size should be generally positive in contemporary populations in nature (Kingsolver and Pfennig 2004; Kingsolver and Diamond 2011). These analyses reported that selection does tend to be, in general, directional for larger body size and stronger when compared to other types of traits. These results have been interpreted as supportive for the idea that individual, large-size fitness advantages could be a mechanism underlying the evidence for Cope's rule (Kingsolver and Pfennig 2004).

We suggest that a complimentary and perhaps more direct test for Cope's rule would be to assess actual trait changes, instead of selection estimates, in contemporary populations. These trait changes might represent a micro-evolutionary pattern (response to selection). Such an analysis of trends in mean phenotype circumvents some limitations of selection estimates (see Discussion) and provides a more direct assessment. Specifically, if micro-evolutionary data support the idea that individual large-size advantages provide an explanation for Cope's rule, those data should generally show increases in body size in contemporary populations. A number of individual studies have reported data that could be used to test this expectation. For example,

increasing body size has been reported for some contemporary populations of invertebrates (Huey et al. 2000; D’Amico et al. 2001). Conversely, evidence also exists that body size can decrease in relation to environmental perturbations such as climate change (Millien et al. 2006; Blois et al. 2008; Teplitsky and Millien 2014). However, general inferences require analyses across many populations, an endeavor now made possible by the assembly of a database of rates of phenotypic change in contemporary populations (Hendry and Kinnison 1999; Kinnison and Hendry 2001; Hendry et al. 2008).

We here use an updated version of this database to examine phenotypic trends that could be corollaries of Cope’s rule, corollaries selected to be as similar as possible to those advanced based on previous analyses of selection estimates (Kingsolver and Pfennig 2004; Kingsolver and Diamond 2011). We first use the entire database to answer two questions: (1) Is body size generally increasing within populations? and (2) Are rates for body size change more positive (or less negative) than rates for other phenotypic traits? Given that body size changes could differ among taxonomic groups (Yom-Tov and Geffen 2011; Teplitsky and Millien 2014), sexes (Andersson 1994), or anthropogenic disturbances such as harvesting (Hendry et al. 2008; Darimont et al. 2009; Sharpe and Hendry 2009), we also ask (3) Does body size increase when accounting for structure in the database?

These analyses of the entire database include results for wild-caught individuals whose phenotypes can be influenced by both genetic and plastic effects (Rausher 1992; Mauricio and Mojonner 1997; Stinchcombe et al. 2002). Thus, we finally ask: Is the genetically-based component of body size generally increasing within populations? For this last question, analyses were based on a separate database of studies that used “animal model” methods (Wilson et al. 2010) to estimate temporal changes in mean breeding values for body size. This is important

because the trait of interest, in our case, body size, must be heritable as well as under selection as dictated by the breeder's equation (Lush 1937). We recognize that our analyses focus on *phenotypic* changes rather than *evolutionary* changes, yet much of the existing micro- and macro-evolutionary inferences about Cope's Rule have been drawn from phenotypic data, and thus, our analyses are parallel to previous work emphasizing evolutionary changes.

## **Materials and Methods**

We started from the published database of Hendry et al. (2008), who collated rates of phenotypic change from studies of contemporary populations: i.e., over the last few hundred years. We then improved and modified the database in several ways. First, some minor errors were corrected, such as ensuring the timeframe for a given study system spanned at least one generation. Second, additional studies published up to 2012 were added as we discovered them. Third, we included only allochronic studies (data obtained from the same population at multiple times) and excluded synchronic studies because the latter cannot reveal the direction of change. Fourth, one author (MMT) used the Kingsolver and Diamond (2011) system to classify traits into different classes: body size, other morphology, physiological, phenology, and other life history. The database used in this study is included in the Supplemental Materials.

For body size, we followed previous analyses (Kingsolver and Pfennig 2004; Siepielski et al. 2009, 2013) in using only direct measurements, such as total length or mass, as opposed to morphological proxies, such as tarsus length in birds. Although trends for such proxies might be expected to be similar to those for body size, given their correlation with body size, our goal was to exactly parallel the approach used in selection analyses. However, we recognize that morphological traits are often used as proxies for body size, and we also re-ran analyses on a

dataset that reclassified any “other morphological trait” that can scale with body size as “size”. Since trait re-classification did not change our interpretation, we report these additional results for the first two questions in Supplemental Resources 2. Data based on mass and volume, as opposed to a linear dimension, were cube-root transformed to allow for among study comparisons (Amadon 1943; Uyeda et al. 2011).

For rates of phenotypic change, we calculated both Darwins, which quantify proportional change on an absolute time scale, and Haldanes, which quantify changes in standard deviation units on a generation time scale (reviewed in Gingerich 1993; Hendry and Kinnison 1999; Kinnison and Hendry 2001). Darwins were calculated as

$$\frac{\ln(\bar{X}_2) - \ln(\bar{X}_1)}{10^6 \text{ years}}$$

where the difference between the natural logarithms of the mean trait values  $\bar{X}_1$  and  $\bar{X}_2$  are divided by elapsed time in millions of years. Haldanes were calculated as

$$\frac{\left(\frac{\bar{X}_2}{SD_p}\right) - \left(\frac{\bar{X}_1}{SD_p}\right)}{g}$$

where the difference between the mean trait values  $\bar{X}_1$  and  $\bar{X}_2$  divided by the pooled standard deviation of both populations  $SD_p$  is divided by the number of elapsed generations ( $g$ ). Both metrics were used because they have different properties and only one or the other can be calculated for some studies. In nearly all cases, we extracted data from the original papers, or

obtained them from the authors, so as to calculate rates of change ourselves because rates reported in the literature are sometimes incorrect or the absolute values only are reported.

Many studies in the database consisted of samples at only two different times, which were used for the rate calculations. For studies that were time series with measurements in multiple years, we calculated a linear regression from the time series data and used the end points of the best fit regression line to obtain endpoints so as to provide a direct comparison with the studies having only two sampling times. The pooled standard deviation to calculate Haldanes was calculated as the square root of the within mean square error from the linear regression. The number of time series systems is relatively small ( $N = 12$ ), and future compilations of more time series would be useful as they can be used to assess non-linear changes.

#### *Statistical analyses*

Analyses for the first two questions were performed separately on each of four different metrics: Darwins, Darwin numerators, Haldanes, and Haldane numerators. The reason for using both rates and numerators is that phenotypic changes sometimes scale with time interval and sometimes do not (Kinnison and Hendry 2001; Westley 2011). The data did not meet assumptions of normality (Shapiro-Wilks test;  $0.279 \leq W \leq 0.953$ ;  $p < 0.001$ ), and so non-parametric tests were performed to address the first question. The first two analyses we conduct were designed to be directly comparable to those used in Kingsolver and Pfennig's (2004) analysis of selection estimates.

*Is body size generally increasing within populations?* We used a sign test to determine if change in body size was more commonly positive or negative. We also ran the analyses on subsets of the data divided by taxa (invertebrates, vertebrates, and plants) as well as "natural"



versus human-perturbed situations. The latter specifically included climate change, fish ladder installation, introductions, and range expansion, as well as in situ anthropogenic disturbances including harvesting, landscape change, and pollution.

*Are rates for body size change more positive (or less negative) than rates for other phenotypic traits?* Our first analysis was a one-tailed Wilcoxon rank-sum test to compare changes in body size to other phenotypic traits across the entire database. This analysis is akin to that performed on selection estimates by Kingsolver and Pfennig (2004) and was performed on the different classifications of phenotypic traits.

*Does body size increase when accounting for structure in the database (taxa, disturbance, or sex)?* Given the heterogeneous nature of the dataset, we conducted a formal analysis based on a linear mixed-effect model framework (using the *nlme* package in R, Pinheiro et al. 2015). Plant and animal data were modeled separately because (1) plants and animals differ in growth patterns and selection regimes for plants and animals and (2) to avoid model overfitting because of a lack of data for predictors “sex” and “disturbance” in plants. All models used square root transformed Darwin or Haldane numerators as the response variable, log-transformed “generations” as a covariate, and “study system” as the random structure. Some studies only reported the final rates, and not the generations, so these data were excluded for this analysis. The fixed effect structure for the animal data model included “sex” (male, female, and both), “trait class” (physiology, phenology, other life history, other morphology, and size), “taxa” (vertebrates and invertebrates), and “disturbance” (disturbed and natural), whereas the fixed effect structure for the plant model included only “trait class”.

Furthermore, to account for potential heteroscedasticity (i.e., unequal variances) in within-group errors, the mixed-effect models included specific variance functions (i.e., *varFunc*

constructors in *nlme*; Pinheiro and Bates 2000) that were evaluated based on the AIC criterion (i.e., lowest AIC indicates the best model; Burnham and Anderson 2002, Supp. Table 3). From these models we used the coefficients of fixed-effect predictors to assess relative strength and direction of evolutionary rates for the respective categories. Since our goal in these analyses was simply to assess relative differences in evolutionary rates for body size versus other predictor categories, while controlling for confounding factors, we did not include interactions. Additional details regarding these analyses can be found in Supplemental Resources 1.

*Is genetically-based body size increasing?* For this analysis, we focused on body size time series that presented mean breeding values, which are the additive effect of a genotype on a given trait (Lynch and Walsh 1998; Wilson et al. 2010). We reviewed the existing literature to identify studies that reported mean breeding values through time in natural populations. Breeding values were extracted from a figure in one study (Coltman et al. 2003), whereas the others were provided by the original authors (see Acknowledgements). For each time series, we estimated linear regressions for mean breeding values through time. Although statistical analyses of breeding values have been criticized for failing to account for uncertainty (Hadfield et al. 2010; Wilson et al. 2010), this concern focuses on statistical confidence (downwardly biased errors) and not the slope estimates. Our conclusions were drawn with this point in mind.

## Results

The final database consisted of 1005 data points from 50 published studies representing 148 different species. We estimated 985 rates in Darwins (146 for body size) and 915 rates in Haldanes (70 for body size) (Table 1). Some studies reported multiple populations, and we used the individual populations (N = 187) as our unit of replication for statistical inference.

*Is body size generally increasing within populations?* Overall, body size changes through time were more often negative than positive and this was significant for Darwins (Figure 1, Table 1, Supp. Tables 1-2). All taxonomic groups tended to show negative body size changes through time, with this change being significant for Darwins for vertebrates (Table 1). Both disturbed and natural populations also showed negative body size trends that were significant for Darwins (Table 1).

*Are rates for body size change more positive (or less negative) than rates for other phenotypic traits?* Considering the entire database, changes in body size were not more positive (or less negative) overall than were those for other traits, except for other life history traits in Darwins (Table 2, Supp. Figure 1).

*Does body size increase when accounting for structure in the database (taxa, disturbance, or sex)?* Body size change did not increase or decrease when accounting for taxa, disturbance, or sex in a linear mixed model and when correcting for potential heteroscedascity (Figure 2, Supp. Table 4). Although it appears that plants might be decreasing in size, only two data points contributed to this subset of data for both Darwins and Haldanes (Figure 2).

*Is genetically-based body size increasing?* Estimated trends for body size breeding values varied considerably among the 12 populations (Supp. Table 5), with only two populations showing a significant positive trend and one population showing a significant negative trend (Supp. Table 5, Supp. Figure 2). Given that significance would be lower when accounting for uncertainty in the estimates (Hadfield et al. 2010; Wilson et al. 2010), we conclude that no convincing evidence exists for a general trend toward increasing genetically-based body size.

## **Discussion**

We are unable to report support for Cope's rule in the same manner as was possible for analyses of selection coefficients (Kingsolver and Pfennig 2004; Kingsolver and Diamond 2011). First, phenotypic body size is not generally increasing in contemporary populations (Figure 1, Table 1). Second, trends are not more positive (or less negative) for body size than for other traits (Table 2, Supp. Fig 1). Third, a mixed model analysis does not indicate that body size is increasing, even after accounting for structure in the database (i.e. sex, disturbance, and taxa, Fig. 2, Supp. Table 4). Fourth, time series of breeding values do not reveal a general tendency toward increasing genetically-based body size (Supp. Figure 2, Supp. Table 5). At face value, these results are not consistent with the earlier analyses of selection coefficients (Kingsolver and Pfennig 2004; Kingsolver and Diamond 2011). However, we note that many of the positive, directional selection estimates for body size are very weak, and many estimates were negative or very close to zero. We first consider potential reasons for the different outcomes of these two types of analyses (selection versus phenotypic rates of change), and we then reconsider Cope's rule in general.

First, the selection and phenotypic change databases differ in the types of populations they include. The selection database excludes manipulated populations (Kingsolver et al. 2001), whereas the phenotypic change database does not. That is, the latter database includes introduced and harvested populations. Such disturbed populations, especially harvested ones, might be expected to experience particularly fast decreases in body size (Hendry et al. 2008; Darimont et al. 2009; Sharpe and Hendry 2009). However, even if we consider only undisturbed "natural" populations, our analyses do not find any evidence that body size is increasing (Table 1, Supp. Tables 1-2). Second, selection estimates are often limited owing to small sample sizes, unmeasured confounding variables, spatiotemporal variation, and imperfect fitness surrogates

(Kingsolver et al. 2001; Hereford et al. 2004; Hersch and Phillips 2004; Siepielski et al. 2009, 2013; Morrissey and Hadfield 2012; Walker 2014). Third, selection estimates are likely subject to a publication bias towards large, significant estimates (Kingsolver et al. 2001; Kingsolver and Pfennig 2004; Siepielski et al. 2009, 2013). Fourth, a fundamental disconnect can exist between selection and phenotypic change (Merilä et al. 2001; Haller and Hendry 2014) as a result of counter-gradient environmental changes (Larsson et al. 1998; Husby et al. 2011), environmental covariance between traits and fitness (Rausher 1992; Mauricio and Mojonner 1997; Stinchcombe et al. 2002), and covariance between non-heritable traits and fitness (Price et al. 1988; Price and Liou 1989). For all of these reasons, and those we will add below, it is possible that estimates of phenotypic change are a better indicator of micro-evolutionary trends than are estimates of selection (Gotanda and Hendry 2014), although inferences based on phenotypic rates are not without their own caveats, which we also discuss below.

Given the above findings and assertions, it is appropriate to revisit typical arguments summarized in the first paragraph of the introduction for why body size should be under positive selection. The more subtle reality is that a number of good reasons exist for why selection on body size should not be typically positive. In particular, selection estimates almost always use fitness components as opposed to total fitness, and positive selection acting through one component is expected to be often offset by negative selection acting through another component (Blanckenhorn 2000; Purvis and Orme 2005; Kingsolver and Pfennig 2007; Collar et al. 2011). Furthermore, larger body size can have a negative impact on several fitness components (see Introduction). More generally, total selection on traits in well-adapted populations is expected to be stabilizing rather than directional, though the vast majority of estimates are close to zero and non-significant (Haller and Hendry 2014). We recognize that changing environmental conditions

or high gene flow can impose directional selection, and that interpretation of analyses of selection estimate databases can vary, but no reason exists why such effects would generally favor larger body size.

Our analyses have their own set of caveats. First, we did not account for phylogenetic relationships due to the wide phylogenetic breadth of the species in the dataset. Second, although we did include sex in our full model, we did not focus specifically on sex specific trends or any resulting changes in sexual dimorphism, although this would be an interesting avenue of future analysis. Third, our analyses were based on phenotypes, and so might not reflect genetic change. Traits that undergo evolutionary change must be both heritable and under selection. However, this caveat similarly applies to the previously analyzed phenotypic selection estimates and also for previous macro-evolutionary analyses of Cope's rule. Size changes inferred from the fossil record could very well reflect genetic changes, but these data are very difficult to obtain, and all conclusions drawn have been based on phenotypic measurements. Our phenotypic perspective is therefore directly comparable to previous approaches. Lastly, our analysis of breeding values attempted to directly eliminate plastic effects of phenotypic change, and the results were consistent with our larger phenotype-based analyses. Phenotypic plasticity could have a genetic underpinning, which would suggest a genetic x environment (GxE) component to adaptive trait change (Scheiner 1993; Pigliucci 2001). It would be advantageous to obtain and analyze additional breeding value data sets to better separate genetic, plastic, and potentially GxE contributions.

How do we reconcile our lack of evidence for increasing body size on micro-evolutionary time-scales with Cope's rule? One possibility is that the individual-level selection that leads to increased body size on macro-evolutionary time scales is episodic, occurring only at specific

time points. If so, these rare events would not be often captured on the relatively short time scales of micro-evolutionary studies (Gingerich 2001; Uyeda et al. 2011). For example, studies of an island population of silvereyes (*Zosterops lateralis chlorocephalus*) shows that historically, body size increased dramatically over a few hundred generations whereas directional selection on body size is currently absent (Clegg et al. 2008).

Alternatively, we might need to look beyond classic micro-evolutionary processes to explain Cope's rule. One such explanation is higher-level selection (Fowler and MacMahon 1982; Brown and Maurer 1986). Specifically, species-sorting in the broad sense can affect speciation and extinction rates at the species level, resulting in phenotypic differences among clades (macro-evolutionary). For example, size increases in marine animals has been attributed to diversification among classes, not size increases within a given lineage (Heim et al. 2015). However, even this higher-level selection can still be interpreted as resulting from organismal-level (micro-evolutionary) processes, such as individual-level fitness advantages for larger body size (Jablonski 2008).

In conclusion, we found that phenotypic rates of change do not match previous assertions of generally positive directional selection on body size (Kingsolver and Pfennig 2004; Kingsolver and Diamond 2011), nor do they provide micro-evolutionary support for Cope's rule. We suspect that these different outcomes reflect a fundamental disconnect between selection estimates and phenotypic change, and that well-adapted populations are more likely to be under stabilizing selection for body size than directional selection. We also suggest that, because of inherent differences in micro- and macro-evolutionary time scales and selection at different levels (e.g. individual vs. populations vs. species), further attempts to seek a mechanistic explanation for Cope's rule on micro-evolutionary timescales by focusing only on phenotypes

might not be the most profitable endeavor. Instead, we suggest that future studies should focus on untangling the phenotypic, plastic, and GxE contributions that would provide more conclusive micro-evolutionary support for Cope's rule.

## **Acknowledgements**

KMG was funded in the form of a Vanier Canada Graduate Scholarship from the Natural Sciences and Engineering Research Council of Canada (NSERC), APH was funded by an NSERC Discovery Grant, and CC was funded by a CONICYT scholarship through the government of Chile. We thank A. Charmantier, D. Garant, A. Husby, C. Teplitsky, and A. Vøllestad for generously sharing their breeding values data with us. We also thank the editor and three anonymous reviewers for their constructive comments on a previous version of the manuscript.



## References

- Alberdi, M. T., E. Ortiz-Jaureguizar, and J. L. Prado. 1998. A quantitative review of European stenonoid horses. *J. Paleontol.* 72:371–387.
- Alroy, J. 1998. Cope's rule and the dynamics of body mass evolution in North American fossil mammals. *Science*. 280:731–734.
- Amadon, D. 1943. Bird weights as an aid in taxonomy. *Wilson Bull.* 55:164–177.
- Andersson, M. 1994. *Sexual Selection*. Princeton University Press, Princeton, N.J.
- Arendt, J. D. 1997. Adaptive intrinsic growth rates: an integration across taxa. *Q. Rev. Biol.* 72:149–177.
- Arendt, J. D., and D. S. Wilson. 1999. Countergradient selection for rapid growth in pumpkinseed sunfish: disentangling ecological and evolutionary effects. *Ecology* 80:2793–2798.
- Blanckenhorn, W. U. 2000. The evolution of body size: what keeps organisms small? *Q. Rev. Biol.* 75:385–407.
- Blois, J. L., R. S. Feranec, and E. A. Hadly. 2008. Environmental influences on spatial and temporal patterns of body-size variation in California ground squirrels (*Spermophilus beecheyi*). *J. Biogeogr.* 35:602–613.
- Bonner, J. T. 1988. *The Evolution of Complexity by Means of Natural Selection*. Princeton University Press, Princeton, N.J.
- Bonner, J. T. 2006. *Why Size Matters : From Bacteria to Blue Whales*. Princeton University Press, Princeton.
- Bromham, L., A. Rambaut, and P. Harvey. 1996. Determinants of rate variation in mammalian DNA sequence evolution. *J. Mol. Evol.* 43:610–621.

- Brown, J. H., and B. A. Maurer. 1986. Body size, ecological dominance and Cope's rule. *Nature* 324:248–250.
- Burnham, K. P., and D. R. Anderson. 2002. Model selection and multimodel inference: a practical information-theoretic approach. Springer, New York.
- Calder, W. A. 1984. Size, Function, and Life History. Harvard University Press, Cambridge, Mass.
- Carlson, S. M., E. M. Olsen, and L. A. Vøllestad. 2008. Seasonal mortality and the effect of body size: a review and an empirical test using individual data on brown trout. *Funct. Ecol.* 22:663–673.
- Chaloner, W. G., and A. Sheerin. 1979. Devonian macrofloras. *Spec. Pap. Palaeontol.* 23:145.
- Chown, S. L., and K. J. Gaston. 2010. Body size variation in insects: a macroecological perspective. *Biol. Rev.* 85:139–169.
- Churchill, M., M. T. Clementz, and N. Kohno. 2014. Cope's rule and the evolution of body size in Pinnipedimorpha (Mammalia: carnivora). *Evolution*, doi: 10.1111/evo.12560.
- Clegg, S. M., F. D. Frentiu, J. Kikkawa, G. Tavecchia, and I. P. F. Owens. 2008. 4000 years of phenotypic change in an island bird: heterogeneity of selection over three microevolutionary timescales. *Evolution* 62:2393–2410.
- Collar, D. C., J. A. Schulte, and J. B. Losos. 2011. Evolution of extreme body size disparity in monitor lizards (*Varanus*). *Evolution* 65:2664–2680.
- Coltman, D. W., P. O'Donoghue, J. T. Jorgenson, J. T. Hogg, C. Strobeck, and M. Festa-Bianchet. 2003. Undesirable evolutionary consequences of trophy hunting. *Nature* 426:655–658.

- Cooper, N., and A. Purvis. 2010. Body size evolution in mammals: complexity in tempo and mode. *Am. Nat.* 175:727–738.
- Cope, E. D. 1885. On the evolution of the Vertebrata, progressive and retrogressive (continued). *Am. Nat.* 19:341–353.
- Cope, E. D. 1896. *The Primary Factors of Organic Evolution*. Open Court Pub. Co., Chicago.
- D’Amico, L. J., G. Davidowitz, and H. F. Nijhout. 2001. The developmental and physiological basis of body size evolution in an insect. *Proc. R. Soc. B Biol. Sci.* 268:1589.
- Darimont, C. T., S. M. Carlson, M. T. Kinnison, P. C. Paquet, T. E. Reimchen, and C. C. Wilmers. 2009. Human predators outpace other agents of trait change in the wild. *Proc. Natl. Acad. Sci. U. S. A.* 106:952–954.
- Dibattista, J. D., K. A. Feldheim, S. H. Gruber, and A. P. Hendry. 2007. When bigger is not better: selection against large size, high condition and fast growth in juvenile lemon sharks. *J. Evol. Biol.* 20:201–212.
- Dombroskie, S. L., and L. W. Aarssen. 2010. Within-genus size distributions in angiosperms: small is better. *Perspect. Plant Ecol. Evol. Syst.* 12:283–293.
- Fowler, C. W., and J. A. MacMahon. 1982. Selective extinction and speciation: their influence on the structure and functioning of communities and ecosystems. *Am. Nat.* 119:480–498.
- Gingerich, P. 2001. Rates of evolution on the time scale of the evolutionary process. *Genetica* 112-113:127–144.
- Gingerich, P. D. 1993. Quantification and comparison of evolutionary rates. *Am. J. Sci.* 293:453–478.

- Gotanda, K. M., and A. P. Hendry. 2014. Using variation in an adaptive trait to consider the potential consequences of temporal variation in selection: spatiotemporal variation in guppy colour. *Biol. J. Linn. Soc.* 112:108–122.
- Hadfield, J. D., A. J. Wilson, D. Garant, B. C. Sheldon, and L. E. B. Kruuk. 2010. The misuse of BLUP in ecology and evolution. *Am. Nat.* 175:116–125.
- Hallam, A. 1975. Evolutionary size increase and longevity in Jurassic bivalves and ammonites. *Nature* 258:493–496.
- Haller, B. C., and A. P. Hendry. 2014. Solving the paradox of stasis: squashed stabilizing selection and the limits of detection. *Evolution* 68:483–5000.
- Heim, N. A., M. L. Knope, E. K. Schaal, S. C. Wang, and R. J. H. Payne. 2015. Cope's rule in the evolution of marine animals. *Science*. 347:867–870.
- Hendry, A. P., T. J. Farrugia, and M. T. Kinnison. 2008. Human influences on rates of phenotypic change in wild animal populations. *Mol. Ecol.* 17:20–29.
- Hendry, A. P., and M. T. Kinnison. 1999. The pace of modern life: measuring rates of contemporary microevolution. *Evolution* 53:1637–1653.
- Herczeg, G., A. Gonda, and J. Merilä. 2010. Rensch's rule inverted - female-driven gigantism in nine-spined stickleback *Pungitius pungitius*. *J. Anim. Ecol.* 79:581–588.
- Hereford, J., T. F. Hansen, and D. Houle. 2004. Comparing strengths of directional selection: how strong is strong? *Evolution* 58:2133–2143.
- Hersch, E. I., and P. C. Phillips. 2004. Power and potential bias in field studies of natural selection. *Evolution* 58:479–485.
- Hone, D. W. E., and M. J. Benton. 2005. The evolution of large size: how does Cope's Rule work? *Trends Ecol. Evol.* 20:4–6.

- Huey, R. B., G. W. Gilchrist, M. L. Carlson, D. Berrigan, and L. Serra. 2000. Rapid evolution of a geographic cline in size in an introduced fly. *Science*. 287:308–309.
- Husby, A., S. M. Hille, and M. E. Visser. 2011. Testing mechanisms of Bergmann's Rule: phenotypic decline but no genetic change in body size in three passerine bird populations. *Am. Nat.* 178:202–213.
- Jablonski, D. 1997. Body-size evolution in Cretaceous molluscs and the status of Cope's rule. *Nature* 385:250–252.
- Jablonski, D. 2008. Species selection: theory and data. *Annu. Rev. Ecol. Evol. Syst.* 39:501–524.
- Kingsolver, J. G., and S. E. Diamond. 2011. Phenotypic selection in natural populations: what limits directional selection? *Am. Nat.* 177:346–357.
- Kingsolver, J. G., H. E. Hoekstra, J. M. Hoekstra, D. Berrigan, S. N. Vignieri, C. E. Hill, A. Hoang, P. Gibert, and P. Beerli. 2001. The strength of phenotypic selection in natural populations. *Am. Nat.* 157:245–261.
- Kingsolver, J. G., and R. B. Huey. 2008. Size, temperature, and fitness: three rules. *Evol. Ecol. Res.* 10:251–268.
- Kingsolver, J. G., and D. W. Pfennig. 2004. Individual-level selection as a cause of Cope's rule of phyletic size increase. *Evolution* 58:1608–1612.
- Kingsolver, J. G., and D. W. Pfennig. 2007. Patterns and power of phenotypic selection in nature. *Bioscience* 57:561–572.
- Kinnison, M. T., and A. P. Hendry. 2001. The pace of modern life II: from rates of contemporary microevolution to pattern and process. *Genetica* 112:145–164.

- Knouft, J. H., and L. M. Page. 2003. The evolution of body size in extant groups of North American freshwater fishes: speciation, size distributions, and Cope's rule. *Am. Nat.* 161:413–421.
- LaBarbera, M. 1989. Analyzing body size as a factor in ecology and evolution. *Annu. Rev. Ecol. Syst.* 20:97–117. Annual Reviews.
- Lamsdell, J. C., and S. J. Braddy. 2010. Cope's Rule and Romer's theory: patterns of diversity and gigantism in eurypterids and Palaeozoic vertebrates. *Biol. Lett.* 6:265–269.
- Lankford, T. E., J. M. Billerbeck, and D. O. Conover. 2001. Evolution of intrinsic growth and energy acquisition rates. II. Trade-offs with vulnerability to predation in *Menidia menidia*. *Evolution* 55:1873–1881.
- Larsson, K., H. P. van der Jeugd, I. T. van der Veen, and P. Forslund. 1998. Body size declines despite positive directional selection on heritable size traits in a barnacle goose population. *Evolution* 52:1169–1184.
- Lush, J. L. 1937. *Animal Breeding Plans*. Iowa State College Press, Ames, Iowa.
- Lynch, M., and B. Walsh. 1998. *Genetics and Analysis of Quantitative Traits*. Sinauer, Sunderland, MA.
- Mauricio, R., and L. E. Mojonner. 1997. Reducing bias in the measurement of selection. *Trends Ecol. Evol.* 12:433–436.
- Merilä, J., B. C. Sheldon, and L. E. B. Kruuk. 2001. Explaining stasis: microevolutionary studies in natural populations. *Genetica* 112:199–222.
- Millien, V., S. K. Lyons, L. Olson, F. A. Smith, A. B. Wilson, and Y. Yom-Tov. 2006. Ecotypic variation in the context of global climate change: revisiting the rules. *Ecol. Lett.* 9:853–869.

- Moen, D. S. 2006. Cope's rule in cryptodiran turtles: do the body sizes of extant species reflect a trend of phyletic size increase? *J. Evol. Biol.* 19:1210–1221.
- Morrissey, M. B., and J. D. Hadfield. 2012. Directional selection in temporally replicated studies is remarkably consistent. *Evolution* 66:435–442.
- Novack-Gottshall, P. M. 2008. Ecosystem-wide body-size trends in Cambrian–Devonian marine invertebrate lineages. *Paleobiology* 34:210–228.
- Peters, R. H. 1983. *The Ecological Implications of Body Size*. Cambridge University Press, Cambridge.
- Pigliucci, M. 2001. *Phenotypic Plasticity: Beyond Nature and Nurture*. Johns Hopkins University Press, Baltimore.
- Pinheiro, J., D. Bates, S. DebRoy, D. Sarkar, and R. C. Team. 2015. *nlme: Linear and Nonlinear Mixed Effects Models*.
- Price, T., M. Kirkpatrick, and S. J. Arnold. 1988. Directional selection and the evolution of breeding date in birds. *Science*. 240:798–799.
- Price, T., and L. Liou. 1989. Selection on clutch size in birds. *Am. Nat.* 134:950–959.
- Purvis, A., and C. D. L. Orme. 2005. Evolutionary trends in body size. Pp. 1–18 *in* J.-C. Carel, P. A. Kelly, and Y. Christen, eds. *Deciphering Growth*. Springer Berlin Heidelberg.
- Rausher, M. D. 1992. The measurement of selection on quantitative traits: biases due to environmental covariances between traits and fitness. *Evolution* 46:616–626.
- Rensch, B. 1948. Histological changes correlated with evolutionary changes of body size. *Evolution* 2:218–230.
- Scheiner, S. 1993. Genetics and evolution of phenotypic plasticity. *Annu. Rev. Ecol. Syst.* 24:35–68.

- Sharpe, D. M. T., and A. P. Hendry. 2009. Life history change in commercially exploited fish stocks: an analysis of trends across studies. *Evol. Appl.* 2:260–275.
- Siepielski, A. M., J. D. DiBattista, and S. M. Carlson. 2009. It's about time: the temporal dynamics of phenotypic selection in the wild. *Ecol. Lett.* 12:1261–1276.
- Siepielski, A. M., K. M. Gotanda, M. B. Morrissey, S. E. Diamond, J. D. DiBattista, and S. M. Carlson. 2013. The spatial patterns of directional phenotypic selection. *Ecol. Lett.* 16:1382–1392.
- Stanley, S. M. 1973. An explanation for Cope's rule. *Evolution* 27:1–26.
- Stanley, S. M. 1979. *Macroevolution, Pattern and Process*. W.H. Freeman, San Francisco.
- Stinchcombe, J. R., M. T. Rutter, D. S. Burdick, P. Tiffin, M. D. Rausher, and R. Mauricio. 2002. Testing for environmentally induced bias in phenotypic estimates of natural selection: theory and practice. *Am. Nat.* 160:511–523.
- Teplitsky, C., and V. Millien. 2014. Climate warming and Bergmann's rule through time: is there any evidence? *Evol. Appl.* 7:156–68.
- Uyeda, J. C., T. F. Hansen, S. J. Arnold, and J. Pienaar. 2011. The million-year wait for macroevolutionary bursts. *Proc. Natl. Acad. Sci.* 108:15908–15913.
- Walker, J. A. 2014. The effect of unmeasured confounders on the ability to estimate true performance or selection gradient (and other partial regression coefficients). *Evolution* 68:2128–2136.
- Westley, P. A. H. 2011. What invasive species reveal about the rate and form of contemporary phenotypic change in nature. *Am. Nat.* 177:496–509.



Wilson, A. J., D. Réale, M. N. Clements, M. M. Morrissey, E. Postma, C. A. Walling, L. E. B.

Kruuk, and D. H. Nussey. 2010. An ecologist's guide to the animal model. *J. Anim. Ecol.*

79:13–26.

Yom-Tov, Y., and E. Geffen. 2011. Recent spatial and temporal changes in body size of

terrestrial vertebrates: probable causes and pitfalls. *Biol. Rev. Camb. Philos. Soc.* 86:531–

41.

## Appendix 1.

### Breeding values studies.

- Charmantier, A., L. E. B. Kruuk, J. Blondel, and M. M. Lambrechts. 2004. Testing for microevolution in body size in three blue tit populations. *J. Evol. Biol.* 17:732-743.
- Coltman, D. W., P. O'Donoghue, J. T. Jorgenson, J. T. Hogg, C. Strobeck, and M. Festa-Bianchet. 2003. Undesirable evolutionary consequences of trophy hunting. *Nature* 426:655-658.
- Garant, D., L. E. B. Kruuk, R. McCleery, H., and B. C. Sheldon. 2004. Evolution in a changing environment: a case study with Great Tit fledging mass. *Am. Nat.* 164:E115-E129.
- Husby, A., S. M. Hille, and M. E. Visser. 2011. Testing mechanisms of Bergmann's Rule: phenotypic decline but no genetic change in body size in three passerine bird populations. *Am. Nat.* 178:202-213.
- Serbezov, D., L. Bernatchez, E. M. Olsen, and L. A. Vøllestad. 2010. Quantitative genetic parameters for wild stream-living brown trout: heritability and parental effects. *J. Evol. Biol.* 23:1631-1641.
- Teplitsky, C., J. A. Mills, J. S. Alho, J. W. Yarrall, and J. Merilä. 2008. Bergmann's rule and climate change revisited: disentangling environmental and genetic responses in a wild bird population. *Proc. Natl. Acad. Sci.* 105:13492-13496.

## Figure Legends

Figure 1. Frequency histograms for Darwins, Haldanes, and their numerators for body size only. Overall, rates were more often negative than positive, and Darwins and Darwin' numerators were significantly less than 0.

Figure 2. Box plot for Darwin and Haldane numerators and model coefficients from linear mixed effect models. Grey boxplots depict evolutionary rates measure. Black boxplots (dark bold line: sd; thin line: 95% CI) next to grey boxplots depict coefficient estimates for subcategories of each categorical predictor from the respective linear mixed-effect models. Note that these coefficients are estimated relative to the first subcategory of each respective predictor (i.e, for Trait class: Physiology; for Sex: both; for Disturbance: Disturbed; for Taxa: Invertebrates). Sample sizes are reported in Supplementary Tables 1 and 2.

Table 1. Sign-test results for rates of evolution testing whether body size rates were significantly different from zero. Results are shown for all data and when data were subset by either taxa or disturbance. Median rates are given, and bold values mean the median is significantly different from zero. Due to the nature of the sign test, numerators yield the exact same results, and so are not reported. Body size classification followed the trait classification definitions found in Kingsolver and Diamond (2011).

Metric		All	Invertebrates	Plants	Vertebrates	Disturbed	Natural
Darwins	N (body size)	146	2	2	142	81	65
	Median	-1763	-564382	-2893	-1563	-3953	-1087
	p-value	<b>&lt;0.001</b>	0.50	0.50	<b>&lt;0.001</b>	<b>0.002</b>	<b>0.001</b>
Haldanes	N (body size)	70	2	2	66	25	45
	Median	-0.00028	-0.0049	-0.11	-0.00012	0.00049	-0.00031
	p-value	0.403	0.50	0.50	0.71	1	0.23

Table 2. Pairwise Wilcoxon signed-rank test results for size *versus* a different phenotypic trait (one-sided) to see if rates of evolution for body size were higher than other traits. Bold indicates significant P values where body size rates are higher than the other phenotypic trait, though not necessarily *positive*. Trait classification followed the definitions found in Kingsolver and Diamond (2011).

		Other morphology	Phenology	Other life history traits	Physiology
Darwins	W	69532	6326	1313	3311
	P value	1	1	<b>0.025</b>	0.997
Darwin	W	69428	6339	1712	3525
numerators	P value	1	1	0.429	1
Haldanes	W	26355	2560	835	1316
	P value	0.821	0.084	0.607	0.922
Haldane	W	26151	3525	773	1289
numerators	P value	0.790	0.983	0.390	0.889