

NOTE

The Effects of Body Mass on Immune Cell Concentrations of Mammals

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ABSTRACT: Theory predicts that body mass should affect the way organisms evolve and use immune defenses. We investigated the relationship between body mass and blood neutrophil and lymphocyte concentrations among more than 250 terrestrial mammalian species. We tested whether existing theories (e.g., protecton theory, immune system complexity, and rate of metabolism) accurately predicted the scaling of immune cell concentrations. We also evaluated the predictive power of body mass for these leukocyte concentrations compared to sociality, diet, life history, and phylogenetic relatedness. Phylogeny explained >70% of variation in both lymphocytes and neutrophils, and body mass appeared more informative than other interspecific trait variation. In the best-fit mass-only model, neutrophils scaled hypermetrically ($b = 0.11$) with body mass, whereas lymphocytes scaled just shallow of isometrically. Extrapolating to total cell numbers, this exponent means that an African elephant circulates 13.3 million times the neutrophils of a house mouse, whereas their masses differ by only 250,000-fold. We hypothesize that such high neutrophil numbers might offset the (i) higher overall parasite exposure that large animals face and/or (ii) the higher relative replication capacities of pathogens to host cells.

Keywords: allometry, comparative, diet, immunology, life history, social system.

Background

Ecological and life-history traits affect variation in immune system architecture among and within species (Nunn 2002; Lee et al. 2008; Brock et al. 2014; Downs et al. 2014). Although rarely considered, these patterns may be manifes-

tations of constraints imposed by body mass because many other host traits important to interactions with parasites also scale with body mass (Downs et al. 2019*b*). Indeed, body mass relates to parasite exposure risk (Dobson and Hudson 1986; Han et al. 2015*a*) as well as some aspects of immunity, such as T cell reactivity (Blount et al. 2003). However, comparatively little research has probed how immune variation scales to body size (Lee 2006; Schoenle et al. 2018; Downs et al. 2019*b*). Body mass has profound effects on many organismal traits (Peters 1983; Calder 1984; Schmidt-Nielsen 1984; Brown et al. 2004). These scaling relationships are typically expressed with the equation $Y = aM^b$, where b represents the scaling exponent between body mass (M) and a focal trait (Y) and a is a constant (Calder 1984; Schmidt-Nielsen 1984). Typically, scaling relationships are investigated from log-log transformations of data, as linear forms of equations ($\log(Y) = \log(a) + b \times \log(M)$) are easier to interpret. For instance, isometric relationships occur when large organisms are found geometrically equivalent to small organisms, that is, $b = 0$ for concentrations. By contrast, allometric relationships occur when the trait of interest is proportionally larger (i.e., hypermetric) or proportionally smaller (i.e., hypometric) in large organisms than in small organisms (Calder 1984; Schmidt-Nielsen 1984).

Although the immune system is multifaceted and we thus might expect different scaling relationships for different types of immune defenses (Lee 2006; Demas et al. 2011; Downs et al. 2019*b*), three theoretical frameworks are useful for making predictions. Two frameworks predict that lymphocyte concentrations, our focal trait in this study, scale isometrically ($b = 0$). First, the protecton theory assumes that organisms require comparable levels of protection, predicting that lymphocyte concentrations should be directly proportional to body mass (Langman and Cohn 1987). Second, scaling based on the complexity of the immune system (henceforth, complexity framework) is derived from the metabolic theory of ecology (Brown et al. 2004; Wiegand

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Perelson 2004; Perelson et al. 2006). It posits that protection by lymphocytes is dependent on delivery to the site of infection, and, based on assumptions about vasculature and surveillance rates, it too predicts isometric scaling (Wiegand and Perelson 2004; Perelson et al. 2006). This framework was recently extended to predict scaling of innate and adaptive responses to West Nile virus (Banerjee and Moses 2009, 2010; Banerjee et al. 2017). Alternatively, the rate of metabolism theory is derived from the observation that metabolic rates often regulate individual performance (Brown et al. 2004; Careau and Garland 2012). This framework thus predicts a hypometric relationship ($b = -0.25$), largely because basal metabolic rate (BMR) likely drives cellular turnover, differentiation, and trafficking rates, which determine concentrations of cells, including leukocytes (Dingli and Pacheco 2006). For example, the hematopoietic stem cell pool scales similarly with BMR across mammals (Dingli and Pacheco 2006).

Of course, body size is not the only factor apt to affect interspecific variation in leukocyte concentrations or other immune traits. Theory predicts—and many studies reveal—that life-history and ecological traits also explain interspecific variation in immunity (Lee 2006; Schoenle et al. 2018). For example, species that live fast and die young should invest minimally in immunity because of trade-offs with reproduction (Lee 2006). Similarly, trophic level and social system complexity should affect exposure to parasites (Blount et al. 2003; Lee et al. 2008), and as species are not evolutionarily independent units, phylogeny too likely affects immune variation (Harvey and Pagel 1991).

Here, we first asked how body mass scales with lymphocyte and neutrophil concentrations across >250 mammal species spanning a more than 250,000-fold range in body mass. Neutrophils are part of the innate immune system and are important early responders to infections, and lymphocytes include diverse cell types that are functionally involved in adaptive and innate responses, including immunoglobulin production, cytotoxicity, and immune regulation (Murphy et al. 2008; Lanier 2013). Neutrophils and lymphocytes comprise the majority of circulating leukocytes, often >70% (Jain 1993). We then asked how body mass predicted leukocyte concentration variation relative to phylogeny and a combination of life history, diet, and other differences among species.

Methods

Trait Data

We extracted species means of leukocyte concentrations (cells L^{-1}) for 259 mammalian species from the International Species Information System, now called Species360 (Teare 2013; Gillooly et al. 2017). Species360 data came

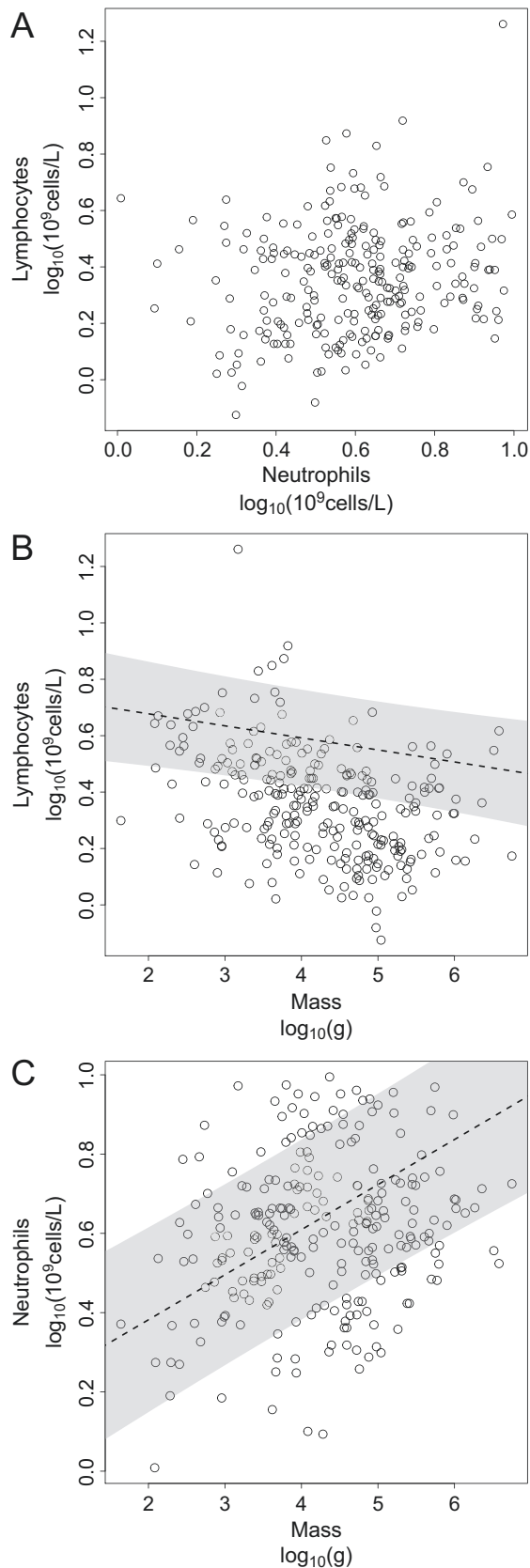
from healthy captive organisms held at facilities accredited by the Association of Zoos and Aquariums. Although captive animals generally have lower cell counts and can express less variation in immune traits than wild ones (Buehler et al. 2008; Viney et al. 2015; Abolins et al. 2017), using captive animals reduces some confounding effects arising from infections and environmental influences that could occur for wild animals. We extracted mean species data on body mass, trophic level, age at maturation, gestation length, interbirth interval, litter size, maximal life span, and sociality (solitary, pair living, or group living) from PanTHERIA (Jones et al. 2009), AnAge (Tacutu et al. 2012), and other published sources. (Summary data and sources are available in the Dryad Digital Repository; <https://doi.org/10.5061/dryad.q4n4884>; Downs et al. 2019a.) From these data, we calculated maximal reproductive potential for each species as follows:

$$\text{maximal reproductive potential} = \frac{\text{maximal life span} - \text{age of maturation}}{(\text{gestation length} + \text{interbirth interval}) \times \text{litter size}} \quad (1)$$

Data Analysis

We used an information-theoretic framework to compare hypotheses for scaling relationships between leukocytes and body mass. We fitted three a priori models to $\log_{10}(\text{lymphocyte})$ and $\log_{10}(\text{neutrophil})$ concentrations: model i, $\log_{10}(\text{leukocyte concentration}) = \log_{10}(a) + 0 \times \log_{10}(\text{mass})$; model ii, $\log_{10}(\text{leukocyte concentration}) = \log_{10}(a) - (1/4) \times \log_{10}(\text{mass})$; and model iii, $\log_{10}(\text{leukocyte concentration}) = \log_{10}(a) + \beta \times \log_{10}(\text{mass})$.

Model i is an intercept-only model that also corresponds to both the protection theory and the complexity framework, whereas model ii corresponds to the rate of metabolism framework. Model iii does not correspond to a specific hypothesis but rather estimates the scaling exponent from the data (b is a fixed parameter in models i and ii). All models were fitted as phylogenetic mixed effects models using the MCMCglmm package (Hadfield 2010; Hadfield and Nakagawa 2010). The phylogenetic covariance matrix for this analysis was estimated using a phylogenetic tree constructed with National Center for Biotechnology Information molecular data and phyloT (fig. A1, available online; Letunic 2015). Polytomies were excluded using the randomization process in phyloT. All mixed models were fitted using a weak inverse-gamma prior with shape and scale parameters set to 0.01 for the random effect of phylogenetic variance (app. B; apps. A–C are available online). To fit model ii, a prior was used for the fixed effects portion of the model with regression coefficients set to the a priori



hypothesized values (i.e., $-1/4$) and heavy prior support placed on that value (app. B). Model outputs confirmed that this approach properly fixed coefficients to the a priori values. Default priors for all other fixed effects were used. Model chains were run for 2.6×10^5 iterations, a 60,000-iteration burn-in, and a 200-iteration thinning interval. Results were robust across alternative priors, and chain length was sufficient to yield negligible autocorrelation. We also estimated unadjusted phylogenetic heritability as a measure of how much of the total observed variation was explained by phylogeny (Housworth et al. 2004) and calculated marginal R^2 as a measure of how much of the total variation was explained by the fixed effects (Nakagawa and Schielzeth 2013). Relative support for each model was determined based on deviance information criterion values and differences among models.

To compare the ability of body mass to explain leukocyte concentrations relative to other biological characteristics, we fitted an additional model (model iv) that included $\log_{10}(\text{mass})$, maximum longevity, trophic level, sociality, maximal reproductive potential, and all pairwise interactions between these additional characteristics and $\log_{10}(\text{mass})$ as fixed effects. In model iv, we used the scaling exponent from the best supported among models i–iii. Model iv was then compared to models i–iii to determine how much intra-specific immune variation was explained by the biological traits in the model including body mass.

Results

Leukocyte Allometry

Lymphocytes (\log_{10} transformed) and neutrophils (\log_{10} transformed) were positively correlated with each other (Pearson's $r = 0.177$, $t_{258} = 2.88$, $P = 0.004$; fig. 1A). The top models for both leukocytes included body mass with the scaling exponents determined by the data (table 1). The top models accounted for 71% of variation in lymphocytes and 86% in neutrophils, indicating that these models have high explanatory power. Body mass explained 3% of lymphocyte variation and 9% of neutrophil variation. The scaling exponent for lymphocytes was slightly below zero ($b = -0.04$, 95% credible interval [CI] = -0.08 to -0.02), whereas it was above zero ($b = 0.11$, 95% CI = 0.09 to 0.14) for neutrophils (fig. 1B, 1C). Traditionally, allometric studies focused

Figure 1: Relationship between lymphocyte and neutrophil concentrations (A; $r = 0.177$). Relationship between host body mass and lymphocyte (B) and neutrophil (C) concentration from simple allometric models (model iii). Equations: $\log_{10}(\text{lymphocyte concentration}) = 0.76$ (0.51 to 0.92) $- 0.04$ (-0.08 to -0.02) $\times \log_{10}(\text{body mass}) + \varepsilon$; $\log_{10}(\text{neutrophil concentration}) = 0.15$ (-0.09 to 0.42) $+ 0.11$ (0.09 to 0.14) $\times \log_{10}(\text{body mass}) + \varepsilon$. The shaded area depicts 95% credible intervals of the slope estimate (β) from the top model.

Table 1: Comparison of models testing the effects of body mass and other factors on lymphocyte and neutrophil concentrations among mammal species

Model	DIC	Δ DIC	λ (95% CI)	Marginal R^2 (95% CI)	Model R^2
Lymphocytes:					
i. β_0	-269.82	-11.25			
ii. $\beta_0 + \beta_1 \times \log_{10}(\text{mass})$	-274.16	-6.92	.68 (.45-.82)	.03 (0-.08)	.71
iii. $\beta_0 - 1/4 \times \log_{10}(\text{mass})$	-166.65	-114.43			
iv. Full model ^a	-281.21	0	.67 (.46-.84)	.066 (.03-.14)	.74
Neutrophils:					
i. β_0	-298.80	-40.34			
ii. $\beta_0 + \beta_1 \times \log_{10}(\text{mass})$	-332.15	-6.99	.77 (.56-.87)	.09 (.05-.22)	.86
iii. $\beta_0 - 1/4 \times \log_{10}(\text{mass})$	-85.74	-253.40			
iv. Full model ^a	-339.14	0	.71 (.51-.81)	.17 (.09-.28)	.85

Note: For all models, the phylogenetic covariance matrix was estimated using a phylogenetic tree constructed with National Center for Biotechnology Information molecular data and phyloT. Phylogenetic heritabilities (λ) indicate how much of the observed variation in either lymphocytes or neutrophils is explained by phylogeny after controlling for fixed effects. Marginal R^2 is a measure of how much of the total variation was explained by the fixed effects. Model R^2 is an estimate of the overall model fit. CI = credible interval; DIC = deviance information criterion; Δ DIC = differences in deviance information criterion among models. Bold indicates the top model overall, and italics indicate the top mass-only model.

^a $\beta_0 + \beta_1 \times \log_{10}(\text{mass}) + \beta_2 \times \text{max reproduction} + \beta_3 \times \text{max longevity} + \beta_4 \times \text{trophic level} + \beta_5 \times \text{sociality} + \beta_6 \times \log_{10}(\text{mass}) \times \text{max reproduction} + \beta_7 \times \log_{10}(\text{mass}) \times \text{max longevity} + \beta_8 \times \log_{10}(\text{mass}) \times \text{trophic level} + \beta_9 \times \log_{10}(\text{mass}) \times \text{sociality}$.

on equations examine only the relationship between body mass and the trait of interest (i.e., no other fixed effects are included). Thus, the scaling exponents from these models are most comparable to the vast literature reporting scaling exponents, and the best test of the predictions in the literature include body mass as the main/only predictor of leukocyte concentrations. Phylogeny accounted for 68% of variation in lymphocytes and 77% in neutrophils.

Best-Fit Models for Leukocyte Variation

The scaling exponent for body mass in model iv was fitted to the data rather than being set a priori. For both leukocytes, the full models (model iv) had more support than the mass-only models (model iii), indicating that ecological and life-history characteristics explained some interspecific variation. The full model accounted for 74% of variation in lymphocytes and 85% in neutrophils, indicating that these models have high explanatory power (table 1). However, life-history and ecological traits increased the explanatory power of fixed effects to only 6.6% for lymphocytes and 17% for neutrophils. Phylogeny accounted for 71% of variation in lymphocytes and 67% in neutrophils (fig. 2). The scaling exponent for lymphocytes was slightly below zero ($b = -0.09$, 95% CI = -0.19 to 0.00), whereas it was above zero ($b = 0.16$, 95% CI = -0.07 to 0.38) for neutrophils.

Discussion

Among the more than 250 mammal species spanning five orders of magnitude in body mass, we found little support

for available theoretical frameworks for the scaling of immune defenses. The mass-only models for lymphocytes did not support any of the a priori predictions, and body mass explained only ~3% of variation in this cell type. No theory predicted the hypermetric scaling exponent ($b = 0.11$) supported for neutrophils, and as with lymphocytes, body mass explained only a small portion (~9%) of the variation in neutrophils. This outcome changed, however, when controlling for phylogeny (~23%). Adding ecological and life-history traits increased the explanatory power of the nonphylogenetic effects to 17% of total variation in neutrophils and 6.6% in lymphocytes. Altogether, phylogeny explained the most variation in neutrophil and lymphocyte concentrations, and our full models accounted for 74% of variation in lymphocytes and 85% in neutrophils.

Allometric Scaling of Leukocyte Concentrations

Our a priori hypotheses for scaling exponents were not supported (for the mass-only models). In the mass-only and full models, lymphocyte concentrations had a shallow hypometric slope with body mass, which is consistent with prior observations in primates and carnivores (Nunn et al. 2000, 2003b) but not Neotropical bats, which showed hypermetric scaling, or rodents, which exhibited isometric scaling (Schneeberger et al. 2013; Tian et al. 2015). These inconsistencies could arise, in part, because circulating lymphocytes are a heterogeneous class of cells with different functions and states of activation (Westermann and Pabst 1990). Alternatively or additionally, the proportion of lymphocyte types might differ among species. For example, 15.4% of lymphocytes in human

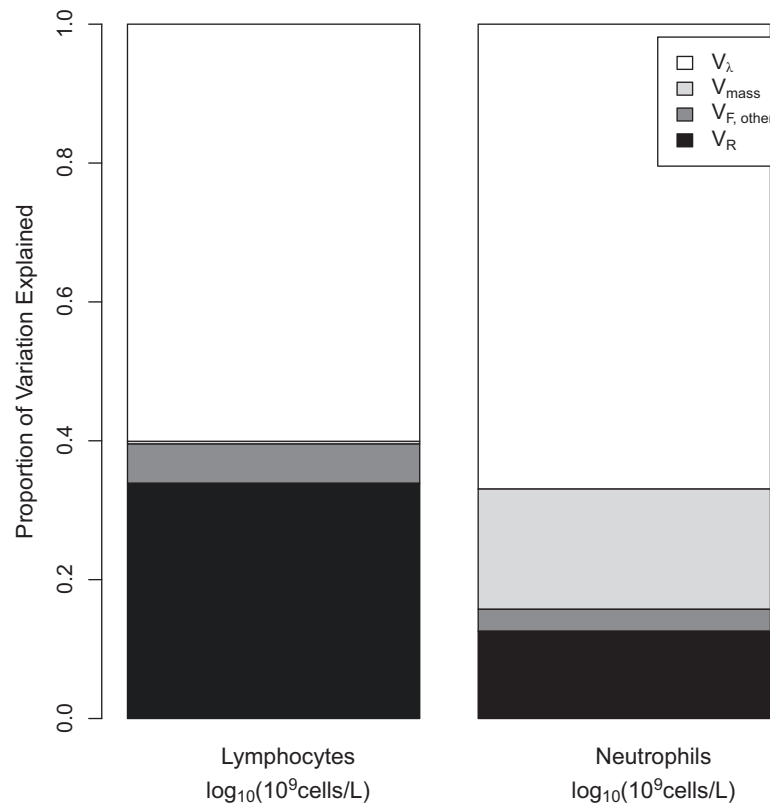


Figure 2: Estimated proportion of variance of lymphocyte and neutrophil concentrations explained by allometric models including additional ecological and life-history parameters (model iv). V_λ = variance explained by the random effects (i.e., phylogeny); V_{mass} = variance explained by body mass; $V_{F, \text{other}}$ = variance explained by all other fixed effects; V_R = residual variance.

females are T helper cells and 6% are B cells, whereas in female Wistar rats 59.0% are T helper cells and 24.5% are B cells (Franch et al. 1993; Evans et al. 1999).

Our most intriguing result was the hypermetric relationship detected for neutrophil concentrations in the mass-only models, particularly as all a priori hypotheses predicted isometry or hypometry. Our finding is consistent with observations in bats (Schneeberger et al. 2013) and rodents (Tian et al. 2015). When life-history and ecological variables were included (model iv), the mean estimate for the scaling exponent was also hypermetric, but the 95% CIs overlapped zero. The addition of maximal reproductive effort seemed to mitigate some of the relationship between body mass and neutrophil concentrations.

Although we found that body mass explained a very small proportion of the interspecific variation in neutrophil concentrations, the biological effect could be profound. Because blood volume scales isometrically (Prothero 2015), hypermetric scaling for neutrophil concentrations translates to hypermetric scaling of whole-animal neutrophil counts. To illustrate, we extrapolated from our equation

for the best mass-only model (model iii, $b = 0.11$) to total neutrophils by using published body masses, blood volumes, and blood densities (Riches et al. 1973; Prothero 1980; Teare 2013). We used the mass-only model to be consistent with published allometric studies, which have traditionally used models that account for only body mass. We found that a 15-g mouse is expected to circulate 2.74×10^{15} neutrophils, whereas a 3,800-kg African elephant would circulate 3.65×10^{22} neutrophils (Riches et al. 1973; Prothero 1980). This represents a difference of seven orders of magnitude in neutrophil number over a difference of five orders of magnitude in body mass.

Why large animals require so many more neutrophils is currently unclear, but the performance-safety trade-off hypothesis predicts that large animals should overinvest in safety (e.g., immunity; Harrison 2017). The mechanism whereby neutrophils protect hosts may also provide some insight. Neutrophils are a major component of mobile, constitutive innate immunity, and they respond to diverse parasites by moving quickly to infected areas, consuming microbes, and/or dying (Nathan 2006; Hidalgo et al. 2019).

Hosts must produce or mobilize new neutrophils rapidly or maintain high enough constitutive numbers to preempt proliferating parasites (Nathan 2006; Hidalgo et al. 2019). If host cell turnover rates scale hypometrically, as predicted (Brown et al. 2004; Dingli and Pacheco 2006), hosts would have a comparatively weaker capacity to produce new defensive cells, providing a reproductive (and evolutionary) advantage to microbes. Relatedly, large animals are disproportionately more likely to be exposed to new parasites than are small ones, putting them at a further disadvantage (Dobson and Hudson 1986). Although a given gram of tissue in a large host is less exposed to parasites because of a low ratio of surface area to volume, absolute exposure to parasites is probably much higher (Dobson and Hudson 1986; Downs et al. 2019b). Given the broad protective effects of neutrophils, disproportionately high concentrations in large mammals might act as a generic first line of defense against diverse and often novel threats.

Influence of Ecological Traits and Life-History Traits on Leukocyte Concentrations

Our modeling approach allowed us to assess whether sociality, trophic level, maximal longevity, and maximal reproductive potential was more informative about interspecific variation in leukocyte concentrations than body mass. The addition of other variables improved model fit for both leukocyte types, and one pattern we detected is consistent with the literature. Specifically, both leukocyte concentrations decreased with reproductive potential (table C1, available online); species with reproductively conservative life histories had comparatively higher concentrations than did productive species. We caution overinterpreting these results, however, because the joint explanatory value of life-history variables was small and because our analytical approach was not designed to determine which ecological and life-history traits were most important in explaining interspecific variation.

Nevertheless, it is somewhat surprising that ecological and life-history variables explained so little variation in our study because they have been important for explaining variation in immune defenses in other interspecific eco-immunology studies (e.g., Tieleman et al. 2005; Lee 2006; Martin et al. 2006, 2007). This apparent discrepancy might arise because different taxonomic groups exhibit different scaling relationships. Also, immune defenses, including leukocyte concentrations, are highly dynamic (Buehler et al. 2012; Hegemann et al. 2012, 2013), and oftentimes investment in immune defenses depends on current or past infection, host stress, age, season, and nutritional condition (Downs et al. 2014; Wilcoxon et al. 2015; MacColl et al. 2017). Intraspecific variation likely accounts for some of the unexplained variation in our data, and not accounting

for it prevented us from investigating scaling relationships within species (Downs and Dochtermann 2014). In the end, as immune defenses relate differently to life-history variation, depending on their relative costs and benefits (Schmid-Hempel and Ebert 2003; Martin et al. 2007; Schoenle et al. 2018), immune defenses are apt to scale differently among and within species, depending on the types of protection they provide.

Phylogeny

Phylogenetic relatedness explained the majority of variation in leukocyte concentrations in our models. Given our analysis, the most we can conclude is that leukocyte concentrations have evolved slowly enough that the signature of phylogeny is observable. Similar phylogenetic conservatism has been observed for heterophil-lymphocyte ratios in birds (Minias 2019), bactericidal capacity among some Carnivora (Heinrich et al. 2016), and body mass–parasite diversity relationships in primates (Nunn et al. 2003a). In contrast, genus did not predict reservoir status among rodent species (Han et al. 2015b), and phylogeny was not predictive of outcomes of epidemiological dynamics (Han et al. 2015a). We therefore encourage additional large studies involving broad taxonomic coverage to provide insight into how phylogeny shapes various aspects of host competence (Downs et al. 2019b).

Conclusion

The coarse nature of leukocyte concentrations and our reliance on zoo-housed animals might obscure some of the eco-evolutionary relevance of our results. Still, our study found an unexpected pattern in the scaling of neutrophils that was not predicted by previously developed theoretical frameworks. Although we do not yet know the mechanism driving these patterns, body size does appear to impose a modest but detectable constraint on mammalian immunity (Bennett 1987; Brown et al. 2004). The cross-species patterns we found for the scaling of immune cells by using a comparative approach indicate a need for the development of theory about how the architecture of the immune system changes across species and suggest that such an approach can be fruitful. Further, broad comparative patterns can be integrated into models to improve our understanding and management of disease dynamics (De Leo and Dobson 1996; Banerjee et al. 2017; Downs et al. 2019b).

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Data and Code Availability

Data used in this analysis are available in the Dryad Digital Repository (<https://doi.org/10.5061/dryad.q4n4884>; Downs et al. 2019a).

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