- 1 Applying generalised allometric regressions to predict live body mass of
- **2** tropical and temperate arthropods
- 4 Running Head: Predicting live arthropod body mass
- 6 Esra H. Sohlström<sup>1,2\*</sup>, Lucas Marian<sup>3</sup>, Andrew D. Barnes<sup>1,3,4</sup>, Noor F. Haneda<sup>5</sup>, Stefan
- 7 Scheu<sup>3</sup>, Björn C. Rall<sup>1,2</sup>, Ulrich Brose<sup>1,2</sup>, Malte Jochum<sup>3,6</sup>
- 9 <sup>1</sup> German Centre for Integrative Biodiversity Research (iDiv) Halle-Jena-Leipzig, Deutscher
- 10 Platz 5e, 04103 Leipzig, Germany
- <sup>2</sup>Institute of Biodiversity, Friedrich Schiller University Jena, Dornburger-Str. 159, 07743
- 12 Jena, Germany

3

5

- <sup>3</sup> J. F. Blumenbach Institute for Zoology & Anthropology, University of Goettingen, Untere
- 14 Karspüle 2, 37073 Goettingen, Germany
- <sup>4</sup> Leipzig University, Institute of Biology, Johannisallee 21, 04103 Leipzig, Germany
- <sup>5</sup> Department of Silviculture, Faculty of Forestry, Bogor Agricultural University, Darmaga
- 17 Campus, Bogor, Indonesia
- <sup>6</sup> Institute of Plant Sciences, University of Bern, Altenbergrain 21, 3013 Bern, Switzerland
- \*Corresponding author: Esra H. Sohlström; Phone: +49 341 97 33206; Email:
- 21 esra.sohlstroem@idiv.de

**Abstract** 

22

23

24

25

26

27

28

29

30

31

32

33

34

35

36

37

38

39

40

41

42

43

44

45

1. The ecological implications of body size extend from the biology of individual organisms to ecosystem-level processes. Measuring body mass for high numbers of invertebrates can be logistically challenging, making length-mass regressions useful for predicting body mass with minimal effort. However, standardised sets of scaling relationships covering a large range in body length, taxonomic groups, and multiple geographical regions are scarce. 2. We collected 6293 arthropods from 19 higher-level taxa in both temperate and tropical locations to compile a comprehensive set of linear models relating live body mass to a range of predictor variables. For each individual, we measured live weight (hereafter, body mass), body length and width, and conducted linear regressions to predict body mass using body length, body width, taxonomic group and geographic region. Additionally, we quantified prediction error when using parameters from arthropods of a different geographic region. 3. Incorporating body width into taxon- and region-specific length-mass regressions yielded the highest prediction accuracy for body mass. Using regression parameters from a different geographic location increased prediction error, causing over- or underestimation of body mass depending on geographical origin and whether body width was included. 4. We present a comprehensive range of parameters for predicting arthropod body mass and provide guidance for selecting optimal scaling relationships. Given the importance of body mass for functional invertebrate ecology and a paucity of adequate regressions to predict arthropod body mass from different geographical regions, our study provides a long-needed resource for quantifying live body mass in invertebrate ecology research. Keywords: allometric scaling, body size, insects, invertebrates, length-mass regression

#### Introduction

47

48

49

50

51

52

53

54

55

56

57

58

59

60

61

62

63

64

65

66

67

68

69

70

Body size is one of the most fundamental traits of living organisms (Peters, 1983). From the individual to the community level, a vast range of ecosystem properties scale with arthropod body size. Body size determines various aspects of an organism's individual biology, such as life-history, behaviour, range size, movement and physiology (Bekoff et al., 1981; Woodward et al., 2005; White et al., 2007; Hirt et al., 2017). Aspects shaping arthropod communities such as species abundance, biomass production, trophic link structure, and interaction strengths are also related to the body size of constituent individuals and populations (Boudreau et al., 1991; Belgrano et al., 2002; Brose et al., 2006; Riede et al., 2011; Rall et al., 2012; Kalinkat et al., 2013). As a result, arthropod body size determines how individuals and communities carry out functions, making it a powerful predictor of ecosystem performance (Barnes et al., 2018). Most biological rates scale with body size following a power-law relationship (Peters, 1983; White et al., 2007), which has important implications for individual and community ecology. In the early 1930s, Kleiber (1932) proposed an allometric scaling relationship of metabolism with body mass following a 3/4 power law function, though this has been extensively debated (see Brown et al., 2004; Kolokotrones et al., 2010; Ehnes et al., 2011). This power-law scaling means that smaller animals have a lower per capita metabolic rate than larger ones, though their mass-specific metabolic rate is higher, yielding distinct patterns of energy demand in populations and communities depending on the relationship between body size and total biomass (Reichle, 1968). Additionally, home- and foraging ranges of animals increase with body size, which has been demonstrated for a wide range of organisms, from small invertebrates to large mammals (Lindstedt et al., 1986; Swihart et al., 1988; Jetz et al., 2004; Greenleaf et al., 2007). Due to the allometric scaling of a large range

of physiological and ecological properties, one can utilise general scaling relationships to predict ecological properties from measured values of organism body size.

71

72

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

While body size is highly useful as a predictive trait for both the response of arthropods to environmental change and also their effects on ecosystem processes, ecologists face many logistic challenges when collecting body size data. Firstly, measurement of arthropod body mass is particularly challenging due to their small body size and typically high abundance. As a consequence, researchers might measure a few individuals of each species and apply an average of these values to the remaining individuals. This practice eliminates intraspecific variation that occurs among sampling sites, especially when the sites are distributed along ecological gradients (Violle et al., 2012). However, in large field sampling campaigns, collecting individual body mass data across all samples is often infeasible due to the logistic difficulties of weighing large numbers of individual organisms. Furthermore, data on live—rather than dry—body mass is often required to accurately relate body size to a range of ecological attributes. For example, physiological rates (such as metabolism), species interactions (e.g., pollination and predation), and behavioural patterns are directly dependent on the body mass of an animal while it is alive, as opposed to its dry mass which serves only as a proxy for live mass. However, dry mass is far more frequently measured as it is extremely difficult to take live body mass measurements of arthropods, particularly in large sampling campaigns. This limitation calls for the provision of practical and accurate tools to acquire individual-level, live arthropod body mass data in order to assess population and community responses in arthropod size structure and investigate corresponding ecosystem processes.

Length-mass regressions have proven to be a powerful tool to predict body mass based on body length measurements (Rogers *et al.*, 1977; Schoener, 1980; Benke *et al.*, 1999; Johnston & Cunjak, 1999; Gruner, 2003; Wardhaugh, 2013) which are much easier to obtain

97

98

99

100

101

102

103

104

105

106

107

108

109

110

111

112

113

114

115

116

117

118

119

120

than measurements of body mass. This approach relies on regression parameters estimated for length-mass relationships, which can be used to predict body mass when only body length data are available. However, finding suitable regression parameters for a given dataset (for example, where parameters are from the same taxonomic group and geographical region) is often not possible. This limitation can be problematic because scaling relationships—and thus, their regression parameters—are likely to vary substantially among taxonomic groups and geographic regions; a discrepancy that has been shown to be especially distinct between tropical and temperate regions (Schoener, 1980; Gruner, 2003; Wardhaugh, 2013). Thus, using length-mass regression parameters from a different geographical region is likely to increase the error in predictions of body mass. Finally, to our knowledge there are no regressions available in the literature that are based on live body-mass measurements and that cover a large range of taxa and multiple geographic regions. Therefore, researchers are typically constrained to using rough conversion factors (Peters, 1983) or more elaborate dry mass-fresh mass regressions (e.g. Mercer et al., 2001), which add further error to body mass predictions due to the very same sources of variation in length-mass scaling relationships (geographic origin, taxon-specificity, etc.). Considering the broad application of body-size data in ecological research, there are surprisingly few studies that provide length-mass regression parameters for terrestrial arthropods, and these are generally restricted to one of either temperate or tropical animals, or to only a few taxonomic groups (Schoener, 1980; Burgherr & Meyer, 1997; Benke et al., 1999; Gruner, 2003; Wardhaugh, 2013). In this paper, we provide an unprecedented dataset of length–mass scaling relationships based on measurements of live body mass and body length of 6293 terrestrial arthropods from both tropical and temperate geographical regions. We measured body mass while the animals were still alive. As such, our regressions will be particularly useful for researchers interested in the physiology, behavior or interaction ecology of their target

organisms. We performed length—mass regressions for arthropods, including various combinations of body width, taxonomic group and geographic origin as additional covariables, and compared the accuracy in predicting body mass among these various models. We hypothesised that prediction accuracy improves with an increasing number of additional predictors (e.g., including body width, taxonomic group and geographic region), as opposed to using only body length as a sole predictor of body mass. Additionally, we expected a higher prediction accuracy when using regression parameters taken from the same geographic region, as opposed to using regression parameters of arthropods from a different geographic region (hereafter, geographically-disjunct regression parameters). Our study thus provides a generalised resource for predicting live body mass across an unprecedented range of terrestrial arthropod groups (including 19 orders of Arachnida, Myriapoda, Crustacea and Insecta), as well as guidance for deciding which scaling relationships to use for predicting arthropod body mass depending on the dataset at hand.

#### **Materials and Methods**

#### Study sites and sampling techniques

To account for different scaling relationships in temperate versus tropical geographical regions, we chose two sampling locations: one temperate location in Germany and one tropical location in Indonesia. Temperate sites were located near Göttingen, Germany (51°32′02″N, 09°56′08″E) at an altitude of around 150 m asl, with a mean annual air temperature of 7.4 °C, mean annual precipitation of 700 mm (Heinrichs *et al.*, 2014) and a vegetation growth period from May to September. Tropical sites were located near Jambi City in Sumatra, Indonesia (1°35′24″S 103°36′36″E), at an altitude around 20 m asl. Jambi City has a mean annual air temperature of 25 °C and a mean annual precipitation of 2100 to 2800 mm (Ishizuka *et al.*, 2002). The sampling sites in both regions included wayside

vegetation, open grassland areas and forest strips. Sampling sites were chosen due to their proximity to the laboratory in both regions to ensure a fast and simple work flow, since animals had to be kept alive after collection and living animals could not be stored for more than eight hours to avoid increased body mass-loss.

Three standard sampling techniques were used in order to cover a broad variety of arthropod taxa and to achieve a sufficient overlap of taxonomic groups from both sampling regions. For active and fast moving ground animals, as well as nocturnal species, live pitfall traps (diameter of 11 cm and height of 12 cm) were used within forest and grassland sites. Pitfall traps were closed with a funnel-shaped lid to prevent animals from escaping. Pitfall traps were buried so the opening of the pitfall was flush with the surface of the ground. They were installed in the morning and animals were collected after 24 hours to avoid loss of individuals due to predation, drowning, or desiccation. Sweep nets were used in open grassland and wayside vegetation plots to collect animals from within low vegetation, shrubs and small trees to sample stationary, as well as fast-moving and flying animals. At the forest sites, less mobile animals from within the litter layer were collected via leaf-litter sieving. Material from the loose leaf litter (F-Layer) on top of the humus layer was collected and sieved with a coarse-meshed grid (2 × 2 cm). Animals that fell through the mesh were hand-collected from a collecting tray and stored in individual vials for further processing.

#### Morphological measurements and data collection

Arthropods were stored in a refrigerator at 10 °C for a maximum of 8 hours after collection to slow down their metabolism and reduce body mass loss. In order to maximise accuracy in live body mass measurements, we conducted preliminary tests of body mass-loss following live capture, comparing live to recently killed arthropods to establish whether specimens should be weighed when alive or dead. As we found considerable variation in body mass

between live and dead animals, we weighed all arthropods whilst still alive on a precision scale (to the nearest 0.01 mg) and subsequently stored them in ethanol (75 %). For measurements of length and maximum width (to the nearest 0.01 mm), pictures of the dorsal or ventral and lateral view were taken with a Dino-Lite Digital Microscope (Dino-Lite Edge; AnMo Electronics Corporation). Afterwards, each individual was measured using ImageJ (Version 1.48k or newer), leaving out appendages to generalize the process. Finally, every individual was identified to family level using 'Insects of Australia' (Commonwealth Scientific and Industrial Research Organization (Australia), 1991), 'Spider Families of the World' (Jocqué & Dippenaar-Schoeman, 2007) and the identification keys of 'Brohmer – Fauna von Deutschland'(Schaefer, 2009). All underlying data can be found online in the Supporting Information (Supporting Data S1).

## Statistical analysis

All statistical analyses were performed using R Version 3.4.0 (R Core Team, 2015). Prior to the analysis, raw data of body length, mass and width were log<sub>10</sub>-transformed. Taxa without width measurements were excluded from the main analysis. However, length-mass regressions for these taxonomic groups, along with a range of regressions for higher-resolution taxonomic groups, were carried out separately and results are presented in the Supporting Information (i.e., regressions for selected taxa based on morphology, taxonomy or behaviour; Table S1).

We performed linear models to test the relationship between body mass and length (L) alone, and with the co-variables width (W), taxonomic group (T) and geographical region (R) in all possible combinations, yielding eight linear models in total (Table 1). For models that included taxonomic group and geographical region, these two factors were combined and treated as a single factor (e.g. temperate Araneae or tropical Araneae to account for the

uneven distribution of some taxonomic groups across geographical regions. The most complex model included length, width, taxonomic group and geographic region (model LWTR) and the least complex model included only length as a single independent variable (model L) (see Supporting Methods S1 for a worked example of body mass predictions using each model type). Finally, model fits were then compared using Akaike's Information Criterion (AIC).

Because we hypothesised that using regression parameters from different geographic regions likely increases error in predictions of arthropod body mass, we assessed this prediction error by quantifying the proportional difference between predicted and observed body mass using geographically-disjunct and geographically non-disjunct regression parameters for the two all-taxa models (models LWR and LR). Specifically, body mass prediction accuracy of regression parameters was calculated as the log-response ratio  $y = log_{10}\left(\frac{a}{b}\right)$ ,

where y is the prediction error of body mass, a is the predicted body mass using length-mass regressions and b is observed body mass. We then assessed how prediction accuracy varied across the range of body length to ascertain if there might be systematic error in body mass predictions depending on arthropod body size.

### **Results**

In total, 6293 individuals from 19 arthropod higher-order taxa were collected, weighed while alive, and measured for body length and width across the Indonesian and German sites (hereafter, tropical and temperate geographic regions). Body length of collected arthropods ranged from 0.60 mm to 68.12 mm and body mass ranged from 0.01 mg to 5108.57 mg (Table 2). As expected, we found a consistent positive scaling relationship for body mas with body length across all collected arthropods.

222

223

224

225

226

227

228

229

230

231

232

233

234

235

236

237

238

239

240

241

242

243

244

245

The most complex model (Model LWTR, including body length, body width, taxonomic group and geographic region as predictors) best explained variation in body mass according to AIC selection and  $r^2$  (Table 3). The consistently positive slope in the relationship between body length and body mass (for all arthropod taxa except for Odonata and Neuroptera) was significantly influenced by body width, taxonomic group and geographic region that the arthropods originated from (Table 3, Figure 1). Thus, the slope of the lengthmass relationship varied with body width, taxonomic group and geographic region (e.g. the slope of the length-mass relationship differed between spiders and beetles as well as between temperate and tropical spiders). The eight different models explained between 81.4 % (model L, least complex model) and 98.6 % (model LWTR, most complex model) of the total variance in body mass (Table 1). According to AIC comparisons, the four models that included body width as a co-variate explained more variation in body mass than models that only included body length as a predictor. In contrast to the results from AIC comparisons, however, r<sup>2</sup>-values suggested that the model including taxonomic group but not body width (model LTR and model LT, Table 1) explained marginally more variance in body mass than the model including body width but not taxonomic group or geographic region (model LW, Table 1). Finally, to test if the application of geographically-disjunct regression parameters (i.e., where regression parameters obtained from one geographic region are used to predict body mass of arthropods in a different geographic region) increases error in body mass predictions, we calculated body mass using geographically-disjunct and geographically non-disjunct regression parameters and quantified the difference from observed body mass. In general, we found that the application of geographically-disjunct parameters for whole-fauna regressions led to increased prediction error of body mass when compared to using non-disjunct regression parameters (Figure 2). Whether this prediction error leads to an under- or overestimation of body mass depended on the geographic region and the morphological traits used to predict body mass. With only body length included as a predictor (Model LR), body mass of temperate arthropods was underestimated on average by 33 % (geometric-mean ratio = 0.77) using tropical regression parameters (Figure 2a), whereas tropical arthropod body mass was overestimated on average by 29 % (geometric-mean ratio = 1.29) when using temperate regression parameters (Figure 2b). Interestingly, when using model LR, prediction error increased with increasing body length for both temperate and tropical arthropods using geographically-disjunct regression parameters (Figure 2a, b). In contrast, when body width was included in the model, the geographically-disjunct regression prediction error shifted between overestimation and underestimation with increasing body length. For temperate arthropods, the models tended to underestimate predicted body mass at small body lengths and overestimate predicted body mass at large body lengths, with an average underestimation of 8% (geometric-mean ratio = 0.92) (Figure 2c). In contrast, body mass of tropical arthropods was overestimated at smaller body lengths and underestimated at larger body lengths when using geographically-disjunct regression parameters in model LWR, with an average overestimation of 10 % (geometric-mean ratio = 1.10) (Figure 2d).

### **Discussion**

246

247

248

249

250

251

252

253

254

255

256

257

258

259

260

261

262

263

264

265

266

267

268

269

270

A wide range of individual- to community-level characteristics are influenced by body size, including abundance, metabolic rate, movement speed or growth rate (Gillooly *et al.*, 2001; White *et al.*, 2007; Hirt *et al.*, 2017). In order to make realistic predictions of these measures, it is essential to have reliable body mass data of target organisms. In our dataset consisting of 6293 organisms spanning 19 higher order taxa from both tropical and temperate geographic regions, we found an overall positive power law relationship between body mass and body length across taxonomic groups and the tropical and temperate geographic regions. The only

exception to this universal trend was for Odonata and Neuroptera, which showed a negative relationship between body mass and body length in a subset of models.

271

272

273

274

275

276

277

278

279

280

281

282

283

284

285

286

287

288

289

290

291

292

293

294

295

The slope of the relationship between body length and mass depended on taxonomic group and geographic region of arthropods. Furthermore, adding body width as an additional morphological predictor strongly improved body mass prediction accuracy. This is probably due to certain groups where the body length-to-width ratio is considerably different to the average of all taxonomic groups (e.g., Staphyilinid beetles have a higher body length-towidth ratio than other beetle families). Thus, using body length as the only predictor of body mass is almost certainly insufficient to capture the morphological variation present within taxonomic groups. Therefore, we expected that the incorporation of body width as an additional predictor in our models should increase the accuracy of body mass predictions. Consistent with our expectations, we found that including body width into the estimation of body mass resulted in a strong improvement of prediction accuracy, in comparison to using body length, alone, as a single predictor of body mass. Moreover, incorporating only body width as an additional predictor yielded higher prediction accuracy than incorporating taxonomic group and geographic region into the models. Body mass is related to the volume of an organism, which can be described by length, width and height. Hence, adding height to predict body mass could lead to more accurate body mass estimations than using only body length and width. Measuring another morphological trait of an organism, however, increases time needed for processing samples, presenting a trade-off between maximising prediction accuracy and minimising time spent measuring traits. As more than 98 % of variance in body mass was described by length, width, taxonomic group and geographic region, the benefit of adding body height would unlikely outweigh the added workload. Indeed, previous studies have shown that including body shape (i.e. body length and width) instead of taxonomy lead to more accurate body mass estimates at the order level, but not at higher taxonomic

resolution (Gruner, 2003; Wardhaugh, 2013). Our results strongly support the finding that the accuracy in predicting body mass improves with additional morphological traits in addition to body length for scaling relationships conducted at the order level.

296

297

298

299

300

301

302

303

304

305

306

307

308

309

310

311

312

313

314

315

316

317

318

319

320

In addition to body width, taxonomic group and geographic origin of the arthropods also influenced the relationship between body length and body mass. This is likely because variation in arthropod body size is influenced by a range of other factors such as evolutionary history and environmental variation (Chown & Gaston, 2010). For example, Bergmann's rule proposes that body size increases with latitude, though the opposite has been observed for arthropods (Mousseau, 1997). Generally speaking, these concepts suggest that the body size of arthropods depends strongly on their geographic origin, particularly with respect to latitude. Therefore, we expected that the application of geographically-disjunct regression parameters from tropical and temperate regions could lead to significant prediction error in arthropod body mass. If researchers are unable to use regression parameters from data collected in a similar geographic regions to their study site (due to a lack of available scaling relationships), this could have important consequences for the body mass-related results drawn from such studies. Consistent with our expectations, we found that the use of geographically-disjunct length-mass regression parameters led to inaccurate body mass predictions ranging between average prediction-errors of 8 % to 33 %, depending on the model used. Furthermore, when only body length was used as a morphological predictor, body mass prediction accuracy of geographically-disjunct regressions decreased with increasing body length of arthropods. This has important consequences for the quality of body mass data, as our results suggest that body mass of longer arthropods will be more severely over- or underestimated than that of shorter arthropods. Therefore, our results highlight a potential systematic bias of decreasing prediction accuracy with increasing body length when applying regression parameters from different geographical regions. Ultimately,

studies investigating body size responses to environmental conditions and the resulting impacts on ecosystem functioning rely on accurate calculations of body mass. Therefore, it is essential for such studies to use length-mass regression parameters that are obtained from similar geographic origins as the organisms for which body mass is being predicted.

Our study provides a highly comprehensive set of regression parameters for predicting live body mass of terrestrial arthropods. This set of regression parameters is useful for researchers wishing to quantify body mass of arthropods across a range of underlying morphological traits, taxonomic identities, and geographical regions. By incorporating all combinations of geographic region, taxonomic group and body width in our allometric models, our results allow investigators to choose length-mass regression parameters for predicting body mass across a broad variety of arthropod datasets. Additionally, we provide an explicit estimation of the prediction error caused by using geographically disjunct regression parameters, to assist in deciding which regression parameters will be the most appropriate for predicting arthropod body mass for a given dataset. In summary, our results will aid future studies in accurately assessing body mass of arthropods, thus increasing our ability to further explore the ecological implications of body size.

#### Acknowledgements

This study was financed by the Deutsche Forschungsgemeinschaft (DFG) in the framework of the collaborative German-Indonesian research project CRC990, phase I. Tropical invertebrates were collected based on Permit No. 2695/IPH.1/KS.02/XI/2012 recommended by the Indonesian Institute of Sciences (LIPI) and issued by the Ministry of Forestry (PHKA). ADB, MJ, and UB were supported by the German Research Foundation within the framework of the Jena Experiment (FOR 1451). ES was supported by the German Federal Environmental Foundation (DBU). Further, MJ was supported by the Swiss National Science

- Foundation. We thank Nisfi Yuniar, Windi Ayu Prawitasari, Paul Brugman, Theresa Bodner,
- Franca Marian and Kristina Barnes for their help with sampling, sorting and identification of
- 348 arthropods in Indonesia and Germany.
  - References

- Barnes, A. D., Jochum, M., Lefcheck, J. S., Eisenhauer, N., Scherber, C., O'Connor, M. I., de
- Ruiter, P. & Brose, U. (2018) Energy Flux: The Link between Multitrophic Biodiversity and
- Ecosystem Functioning. Trends in Ecology & Evolution, 33, 186–197.
- Bekoff, M., Diamond, J. & Mitton, J. B. (1981) Life-history patterns and sociality in canids:
- Body size, reproduction, and behavior. *Oecologia*, **50**, 386–390.
- Belgrano, A., Allen, A. P., Enquist, B. J. & Gillooly, J. F. (2002) Allometric scaling of
- maximum population density: a common rule for marine phytoplankton and terrestrial plants.
- 358 *Ecology Letters*, **5**, 611–613.
- Benke, A. C., Huryn, A. D., Smock, L. A. & Wallace, J. B. (1999) Length-Mass
- 360 Relationships for Freshwater Macroinvertebrates in North America with Particular Reference
- to the Southeastern United States. *Journal of the North American Benthological Society*, **18**,
- 362 308–343.
- Boudreau, P. R., Dickie, L. M. & Kerr, S. R. (1991) Body-size spectra of production and
- biomass as system-level indicators of ecological dynamics. *Journal of Theoretical Biology*,
- **152**, 329–339.
- Brose, U., Williams, R. J. & Martinez, N. D. (2006) Allometric scaling enhances stability in
- complex food webs. *Ecology letters*, **9**, 1228–36.
- Brown, J. H., Gillooly, J. F., Allen, A. P., Savage, V. M. & West, G. B. (2004) Toward a

- metabolic theory of ecology. *Ecology*, **85**, 1771–1789.
- Burgherr, M. & Meyer, E. I. (1997) Regression analysis of linear body dimensions vs. dry
- mass in stream macroinvertebrates. Archiv für Hydrobiologie, **139**, 101–112.
- Chown, S. L. & Gaston, K. J. (2010) Body size variation in insects: a macroecological
- perspective. *Biological Reviews*, **85**, 139–169.
- 374 Commonwealth Scientific and Industrial Research Organization (Australia) (1991) *The*
- insects of Australia: A Textbook for Students and Research Workers (2 Volume Set). Cornell
- 376 University Press, Ithaca, USA.
- Ehnes, R. B., Rall, B. C. & Brose, U. (2011) Phylogenetic grouping, curvature and metabolic
- scaling in terrestrial invertebrates. *Ecology Letters*, **14**, 993–1000.
- Gillooly, J. F., Brown, J. H., West, G. B., Savage, V. M. & Charnov, E. L. (2001) Effects of
- Size and Temperature on Metabolic Rate. *Science*, **293**.
- Greenleaf, S. S., Williams, N. M., Winfree, R. & Kremen, C. (2007) Bee foraging ranges and
- their relationship to body size. *Oecologia*, **153**, 589–596.
- 383 Gruner, D. S. (2003) Regressions of length and width to predict arthropod biomass in the
- Hawaiian Islands. *Pacific Science*, **57**, 325–336.
- Heinrichs, S., Winterhoff, W. & Schmidt, W. (2014) 50 years of constancy and dynamics of
- calcareous beech forests on dry slopes (Carici-Fagetum) A comparison of old and recent
- vegetation releves from the Gottingen forest. *TUEXENIA*, **34**, 9–38.
- Hirt, M. R., Jetz, W., Rall, B. C. & Brose, U. (2017) A general scaling law reveals why the
- largest animals are not the fastest. *Nature Ecology & Evolution*, **1**, 1116–1122.
- Ishizuka, S., Tsuruta, H. & Murdiyarso, D. (2002) An intensive field study on CO2, CH4, and
- N2O emissions from soils at four land-use types in Sumatra, Indonesia. Global

- 392 *Biogeochemical Cycles*, **16**, 22-1-22–11.
- Jetz, W., Carbone, C., Fulford, J. & Brown, J. H. (2004) The Scaling of Animal Space Use.
- 394 *Science*, **306**, 266–268.
- Jocqué, R. & Dippenaar-Schoeman, A. (2007) Spider families of the world. Royal Museum
- 396 for Central Africa, Tervuren, Belgium.
- Johnston, T. A. & Cunjak, R. A. (1999) Dry mass-length relationships for benthic insects: a
- review with new data from Catamaran Brook, New Brunswick, Canada. Freshwater Biology,
- **41**, 653–674.
- Kalinkat, G., Brose, U. & Rall, B. C. (2013) Habitat structure alters top-down control in litter
- 401 communities. *Oecologia*, **172**, 877–887.
- Kleiber, M. (1932) Body size and metabolism. *Hilgardia*, **6**, 315–351.
- Kolokotrones, T., Van Savage, Deeds, E. J. & Fontana, W. (2010) Curvature in metabolic
- 404 scaling. *Nature*, **464**, 753–756.
- Lindstedt, S. L., Miller, B. J. & Buskirk, S. W. (1986) Home range, time, and body size in
- 406 mammals. *Ecology*. Ecological Society of America, **67**, 413–418.
- Mercer, R. D., Gabriel, A. G. A., Barendse, J., Marshall, D. J. & Chown, S. L. (2001)
- 408 Invertebrate body sizes from Marion Island. *Antarctic Science*, **13**, 135–143.
- Mousseau, T. A. (1997) Ectotherms Follow the Converse to Bergmann's Rule. *Evolution*, **51**,
- 410 630–632.
- Peters, R. H. (1983) *The ecological implications of body size*. Cambridge University Press,
- 412 Cambridge, UK.
- R Core Team (2015) R: a language and environment for statistical computing. Vienna,
- 414 Austria: R Foundation for Statistical Computing.

- Rall, B. C., Brose, U., Hartvig, M., Kalinkat, G., Schwarzmuller, F., Vucic-Pestic, O. &
- Petchey, O. L. (2012) Universal temperature and body-mass scaling of feeding rates.
- 417 Philosophical Transactions of the Royal Society B: Biological Sciences, **367**, 2923–2934.
- 418 Reichle, D. (1968) Relation of Body Size to Food Intake, Oxygen Consumption, and Trace
- Element Metabolism in Forest Floor Arthropods. *Ecology*. Ecological Society of America,
- **420 49**, 538–542.
- Riede, J. O., Brose, U., Ebenman, B., Jacob, U., Thompson, R., Townsend, C. R. & Jonsson,
- T. (2011) Stepping in Elton's footprints: a general scaling model for body masses and trophic
- levels across ecosystems. *Ecology Letters*, **14**, 169–178.
- Rogers, L. E., Buschbom, R. L. & Watson, C. R. (1977) Length-Weight Relationships of
- Shrub-Steppe Invertebrates. *Annals of the Entomological Society of America*, **70**, 51–53.
- Schaefer, M. (2009) Brohmer Fauna von Deutschland. Quelle & Meyer, Wiebelsheim,
- 427 Germany.
- Schoener, T. W. (1980) Length-Weight Regressions in Tropical and Temperate Forest-
- 429 Understory Insects. *Annals of the Entomological Society of America*, **73**, 106–109.
- Swihart, R. K., Slade, N. A. & Bergstrom, B. J. (1988) Relating Body Size to the Rate of
- Home Range Use in Mammals. *Ecology*. Ecological Society of America, **69**, 393–399.
- Violle, C., Enquist, B. J., McGill, B. J., Jiang, L., Albert, C. H., Hulshof, C., Jung, V. &
- 433 Messier, J. (2012) The return of the variance: intraspecific variability in community ecology.
- 434 *Trends in Ecology & Evolution*, **27**, 244–252.
- Wardhaugh, C. W. (2013) Estimation of biomass from body length and width for tropical
- rainforest canopy invertebrates. *Australian Journal of Entomology*, **52**, 291–298.
- White, E. P., Ernest, S. K. M., Kerkhoff, A. J. & Enquist, B. J. (2007) Relationships between

body size and abundance in ecology. *Trends in Ecology & Evolution*, **22**, 323–330.

441

- Woodward, G., Ebenman, B., Emmerson, M., Montoya, J., Olesen, J., Valido, A. & Warren,
- P. (2005) Body size in ecological networks. *Trends in Ecology & Evolution*, **20**, 402–409.

**Table 1:** Model comparisons for the eight linear models used to predict live body mass based on different explanatory variables. Models are compared based on AIC and  $r^2$ .

Model no.	Model parameters	AIC	ΔAIC	$r^2$
1 (LWTR)	Length, width, taxa, region	-8551.2011	0	0.9860
2 (LWT)	Length, width, taxa	-8087.7384	463.4627	0.9849
3 (LWR)	Length, width, region	-4377.9316	4173.2695	0.9725
4 (LW)	Length, width	-4267.3045	4283.8966	0.9438
5 (LTR)	Length, taxa, region	-1179.7326	7371,4685	0.9546
6 (LT)	Length, taxa	-793.3381	7757.8630	0.9516
7 (LR)	Length, region	3050.0298	11601.2309	0.9103
8 (L)	Length	3249.5840	11800.7851	0.8143

**Table 2:** Taxonomic groups sampled in the two geographic regions (temperate and tropical), including the number of individuals (n), number of families, length range and mass range (live body mass) per taxon.

Order	1	n		No. of families		Length range (mm)		Mass range (mg)		
	Temp.	Trop.	Temp.	Trop.	Temp.	Trop.	Temp.	Trop.		
Araneae	519	1081	16	27	1.01 - 12.26	0.78 - 25.71	0.15 - 212.78	0.01 - 5108.57		
Coleoptera	408	298	15	21	1.66 - 35.10	1.10 - 43.42	0.33 - 1067.93	0.05 - 3698.96		
Dermaptera	60	130	2	3	3.00 - 13.96	1.87 - 18.71	2.13 - 72.06	0.01 - 92.57		
Dictyoptera	-	247	1	6	-	1.69 - 65.07	-	0.42 - 1060.93		
Diptera	504	189	31	28	1.49 – 16.82	1.58 - 23.61	0.07 - 74.50	0.07 - 165.17		
Geophilomorpha	-	13	-	2	-	7.47 - 33.54	-	0.29 - 21.03		
Hemiptera	598	454	14	35	1.31 - 12.05	0.95 - 23.76	0.27 - 146.90	0.05 - 261.53		
Hymenoptera	222	371	14	23	1.70 - 22.26	0.62 - 31.88	0.06- 835.43	0.01 - 1664.61		
Isopoda	88	88	6	3	2.45 - 16.16	2.45 - 16.16	0.81-181.27	0.22 - 189.52		
Lepidoptera	31	121	4	10	3.56 - 16.23	3.23 - 35.52	1.67-91.02	0.56 - 908.65		
Lithobiomorpha	161	60	1	1	2.77 - 23.63	2.22 - 51.21	0.65 - 170.65	0.01- 439.53		
Neuroptera	21	18	2	4	3.79 - 11.34	3.26 - 27.29	2.61 - 17.44	1.33 - 144.05		
Odonata	-	21	_	4	_	23.37 - 54.83	_	14.24 - 367.32		

Grand total	629	93	2	46	0.60 -	68.10	0.01 - 5108.57	
Total (geogr. region)	2748	3545	122	190	0.930 - 35.1	0.62 - 68.12	0.06 - 1067.93	0.01 - 5108.57
Scolopendromorpha	-	11	-	2	-	4.83 - 41.84	-	0.88 - 276.18
Psocoptera		26	-	3	-	1.12 - 2.92	0.22 - 0.64	0.11 - 8.00
Pseudoscorpionida		36	-	2	-	0.95 - 4.16	1.33 - 19.91	0.16 - 2.12
Polydesmida	12	80	1	1	9.21 - 19.95	4.02 - 32.55	9.24 - 67.25	0.05 - 205.02
Orthoptera	35	277	2	6	3.79 - 24.28	1.28 - 68.12	3.81 - 417.84	0.14 - 3895.10
Opiliones	89	24	3	3	0.93 - 7.53	1.09 - 10.09	0.81 - 95.02	0.40 - 165.61

**Table 3:** Regression parameters for the eight linear models for live body mass prediction in dependence of body length (L, in mm), maximum body width (W, in mm), taxonomic group (T) and geographic region (R, temperate and tropical).

451

Taxonomic group	Region	Intercept	Slope <sub>length</sub>	Slopewidth	SD				
		$(a_x)$	$(b_{length})$	$(b_{width})$					
Model 1: Length-Width-Taxonomic group-Geographic region-Zone (LWTR)									
Araneae	temperate	-0.281	1. 368	1.480	0.100				
Coleoptera	temperate	-0.299	0.874	1.920	0.104				
Dermaptera	temperate	-0.369	1.180	1.580	0.099				
Diptera	temperate	-0.309	0.997	1.595	0.119				
Hemiptera	temperate	-0.420	1.177	1.431	0.078				
Hymenoptera	temperate	-0.450	1.144	1.724	0.115				
Isopoda	temperate	-0.453	0.898	1.756	0.074				
Lepidoptera	temperate	-0.442	1.084	1.720	0.102				
Lithobiomorpha	temperate	-0.549	1.416	1.543	0.064				
Neuroptera	temperate	0.575	-0.042	2.535	0.114				
Opiliones	temperate	-0.241	1.353	1.377	0.131				
Orthoptera	temperate	0.136	0.823	1.713	0.081				
Polydesmida	temperate	-1.400	2.443	0.215	0.035				
Araneae	tropical	-0.464	1.539	1.448	0.127				
Coleoptera	tropical	-0.545	1.175	1.786	0.164				
Dermaptera	tropical	-0.605	1.301	1.704	0.106				
Dictyoptera	tropical	-0.326	0.845	1.764	0.180				
Diptera	tropical	-0.441	1.199	1.399	0.137				
Geophilomorpha	tropical	-0.420	0.964	1.766	0.129				
Hemiptera	tropical	-0.529	1.337	1.260	0.120				
Hymenoptera	tropical	-0.463	1.070	1.798	0.132				

Isopoda	tropical	-0.800	1.646	1.154	0.106
Lepidoptera	tropical	-0.553	1.245	1.667	0.120
Lithobiomorpha	tropical	-1.350	2.112	0.742	0.163
Neuroptera	tropical	-0.727	1.506	1.344	0.146
Odonata	tropical	-0.588	-0.386	4.438	0.181
Opiliones	tropical	-0.384	2.301	0.370	0.128
Orthoptera	tropical	-0.117	1.001	1.673	0.111
Polydesmida	tropical	-0.179	1.012	2.191	0.146
Pseudoscorpionida	tropical	-0.801	1.750	0.300	0.143
Psocoptera	tropical	-0.936	2.294	0.666	0.235
Scolopendromorpha	tropical	-0.962	1.669	1.278	0.051
Model 2: Length-Wi	dth-Taxonomic gro	oup (LWT)			
Araneae	-	-0.410	1.486	1.492	0.129
Coleoptera	-	-0.435	1.039	1.847	0.139
Dermaptera	-	-0.187	0.747	2.228	0.108
Dictyoptera	-	-0.326	0.845	1.764	0.180
Diptera	-	-0.376	1.107	1.498	0.125
Geophilomorpha	-	-0.419	0.964	1.766	0.129
Hemiptera	-	-0.473	1.253	1.362	0.101
Hymenoptera	-	-0.429	1.050	1.801	0.129
Isopoda	-	-0.690	1.387	1.393	0.093
Lepidoptera	-	-0.5539	1.242	1.662	0.117
Lithobiomorpha	-	-0.327	1.083	2.058	0.121
Neuroptera	-	-0.515	1.251	1.533	0.152
Odonata	-	-0588	-0.386	4.438	0.181
Opiliones	-	-0.243	1.442	1.262	0.132
Orthoptera	-	-0.095	0.968	1.729	0.109

Polydesmida	-	-0.417	1.245	1.809	0.141
Pseudoscorpionida	-	-0.801	1.750	0.300	0.142
Psocoptera	-	-0.936	2.294	0.666	0.235
Scolopendromorpha	-	-0.962	1.669	0.300	0.051
Model 3: Length-Wie	dth-Geographic reg	gion (LWR)			
-	temperate	-0.281	1.030	1.597	0.149
-	tropical	-0.370	1.086	1.649	0.186
Model 4: Length-Wi	dth (LW)				
-	-	-0.339	1.066	1.640	0.172
Model 5: Length-Tax	konomic group-Geo	ographic region (LTI	R)		
Araneae	temperate	-0.733	2.623	-	0.151
Coleoptera	temperate	-0.935	2.455	-	0.295
Dermaptera	temperate	-0.947	2.337	-	0.114
Diptera	temperate	-1.057	2.489	-	0.182
Hemiptera	temperate	-0.902	2.386	-	0.219
Hymenoptera	temperate	-1.486	3.018	-	0.195
Isopoda	temperate	-1.292	2.950	-	0.110
Lepidoptera	temperate	-1.294	2.493	-	0.194
Lithobiomorpha	temperate	-1.671	2.780	-	0.101
Neuroptera	temperate	0.156	0.889	-	0.169
Opiliones	temperate	-0.364	2.379	-	0.157
Orthoptera	temperate	-0.640	2.267	-	0.158
Polydesmida	temperate	-1.519	2.595	-	0.037
Araneae	tropical	-0.862	2.611	-	0.191
Coleoptera	tropical	-1.104	2.553	-	0.375
Dermaptera	tropical	-1.775	2.929	-	0.135
Dictyoptera	tropical	-0.644	1.913	-	0.303

Diptera	tropical	-0.973	2.270	-	0.249
Geophilomorpha	tropical	-2.917	2.837	-	0.225
Hemiptera	tropical	-0.813	2.189	-	0.213
Hymenoptera	tropical	-1.422	2.792	-	0.248
Isopoda	tropical	-1.268	2.839	-	0.124
Lepidoptera	tropical	-1.433	2.587	-	0.251
Lithobiomorpha	tropical	-1.884	2.701	-	0.166
Neuroptera	tropical	-0.884	2.112	-	0.197
Odonata	tropical	-0.816	1.856	-	0.300
Opiliones	tropical	-0.453	2.648	-	0.129
Orthoptera	tropical	-0.775	2.205	-	0.192
Polydesmida	tropical	-1.825	2.726	-	0.184
Pseudoscorpionida	tropical	-0.942	2.015	-	0.149
Psocoptera	tropical	-1.154	2.710	-	0.237
Scolopendromorpha	tropical	-2.084	2.702	-	0.116
Model 6: Length-Tax	conomic group (LT)	)			
Araneae	-	-0.830	2.637	-	0.190
Coleoptera	-	-1.042	2.537	-	0.334
Dermaptera	-	-1.316	2.529	-	0.206
Dictyoptera	-	-0.644	1.913	-	0.303
Diptera	-	-1.0318	2.430	-	0.205
Geophilomorpha	-	-2.917	2.837	-	0.225
Hemiptera	-	-0.817	2.237	-	0.219
Hymenoptera	-	-1.401	2.809	-	0.235
Isopoda	-	-1.322	2.967	-	0.119
Lepidoptera	-	-1.390	2.554	-	0.24
Lithobiomorpha	-	-1.888	2.934	-	0.169

Neuroptera	-	-0.871	2.010	-	0.217
Odonata	-	-0.816	1.856	-	0.300
Opiliones	-	-0.385	2.439	-	0.154
Orthoptera	-	-0.791	2.245	-	0.199
Polydesmida	-	-1.986	2.944	-	0.175
Psocoptera	-	-1.154	2.710	-	0.237
Pseudoscorpionida	-	-0.942	2.015	-	0.149
Scolopendromorpha		-2.084	2.702	-	0.116
Model 7: Length-Geo	ographic region (Ll	R)			
-	temperate	-0.730	2.175	-	0.283
-	tropical	-0.822	2.146	-	0.327
Model 8: Length (L)					
-	-	-0.786	2.166	-	0.313

- 453 Regression equations for the eight models:
- 454 Model 1 (LWTR):  $log_{10}(body mass) = a_{taxon region} + b_{length taxon region} \times log_{10}(body length) + b_{width taxon region}$
- 455  $\times \log_{10}(\text{body width})$
- $456 \qquad Model \ 2 \ (LWT): log_{10}(body \ mass) = a_{taxon} + b_{length \ taxon} \times log_{10}(body \ length \ _{taxon}) + b_{width \ taxon} \times b_{taxon} \times b_{taxon}$
- 457 log<sub>10</sub>(body width)
- $Model \ 3 \ (LWR): log 10 (body \ mass) = a_{region} + b_{length \ region} \times log_{10} (body \ length) + b_{width \ region} \times$
- 459 width)

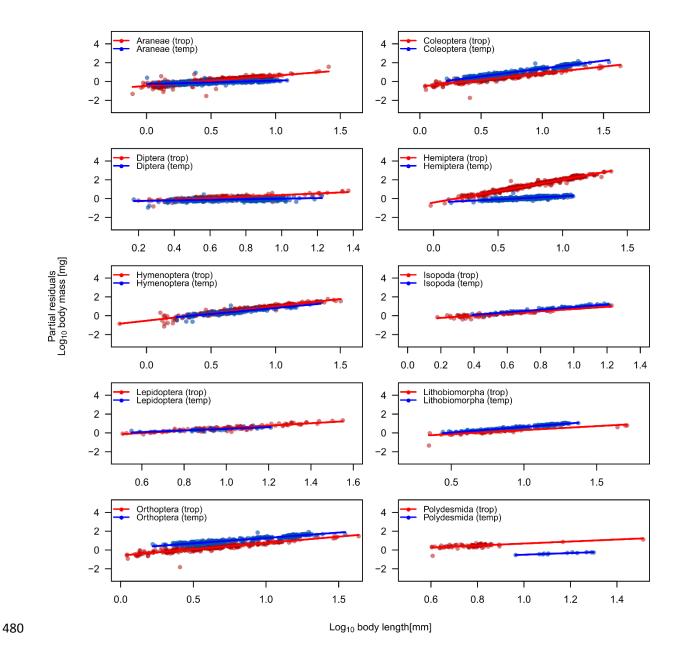
- Model 4 (LW):  $log10(body mass) = a + b_{length} \times log_{10}(body length) + b_{width} \times log_{10}(body width)$
- 461 Model 5 (LTR):  $log10(body mass) = a_{taxon region} + b_{taxon region} \times log_{10}(body length)$
- Model 6 (LT):  $log_{10}(body mass) = a_{taxon} + b_{taxon} \times log_{10}(body length)$
- Model 7 (LR):  $log_{10}(body mass) = a_{region} + b_{region} \times log_{10}(body length)$
- Model 8 (L):  $log_{10}(body mass) = a + b \times log_{10}(body length)$

Figure 1: Length-mass regressions of the best fit model, which included body length, maximum body width, taxonomy and geographic region (LWTR) to predict body mass for the ten most abundant arthropod groups from the temperate (blue) and tropical (red) study areas. The y-axis displays partial residuals and, therefore, shows the effect of body length after correcting for the other variables.

Figure 2: Prediction error (log response ratio of predicted versus observed body mass values) for temperate (blue lines, panels a and c) and tropical (red lines, panel's b and d) arthropod body mass obtained by using geographically disjunct (dashed lines) and non-disjunct (solid lines) regression parameters for the LR (a and b) and LWR (c and d) models. LR = length + region and LWR = length + width + region models.

## Figure 1

479



# Figure 2

482

