Bee foraging distances are dependent on body mass and level of eusociality

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31 March, 2021

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Thoughts and ideas

lets try get it in the functional ecology special issue~ https://besjournals.onlinelibrary.wiley.com/page/j ournal/13652435/homepage/call for papers:animal functional traits

150 word abstract - due by April 30 Paper - due by 31 July

- Is distance the right word? I cant decide between distance or range, range seems more synonymous with resource use and therefore maybe better i.e. they will forage within this range, rather than at this distance
- I think the physiological ~ functional split in estimates (feeder and homing vs. all others) is very interesting. I am open to ideas regarding the names maybe behavioural is better than functional?
- I didn't find an effect of polylecty for either maximum or typical distances i thought there was one but there were a few estimates which were incorrectly coded and after fixing these, there was no effect. Do we keep lecty stuff in paper?
- Not enough coverage to use Family as a predictor #see table(forage.traitsFamily, forage.traitsdistance_type2)
- Henrik had an interesting idea use colony size instead of categorical eusociality
- perhaps one additional analysis with bumblebees split out?

Abstract

1. The foraging distance of bees structures the scale at which bee ~ plant interactions, pollination and other associated ecosystem functions occur. Previous studies have demonstrated that foraging distance is positively allometric (i.e larger bees can forage at greater distances than smaller bees), yet how foraging distance is related to other functional traits important to foraging behavior, such as eusociality and floral specialisation remains unknown.

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- 2. We conducted a systematic review of known bee foraging distances, compiling 411 estimates for 100 species. We divided estimates firstly into *typical* or *maximum* foraging distances and then into physiological (i.e. homing ability) and functional estimates (e.g. molecular methods, nest-plant association studies). For each bee species, we collected information on their body size (intertegular distance), level of eusociality (highly eusocial, primitively eusocial or solitary) and floral specialization (oligolectic vs. polylectic).
- 3. We then conducted a phylogenetic un-weighted meta-analysis of typical and amximum bee foraging distances in relation to body size and functional traits.
- 4. We found that body size was only weakly predictive of both typical and maximum foraging distances: $R^2:0.12~\&~0.16$).
- 5. However, models that included distance type (i.e. physiological and functional foraging distances), in conjunction with eusociality greatly improved predictions of foraging distances ($R^2s:0.36 \& 0.37$).
- 6. Physiological estimates of foraging distances increased more steeply than functional estimates in relation to body size. Further, highly eusocial species can forage at greater distances per unit body mass (ITD) than primitively eusocial or solitary bee species. In contrast, we found no relationship between floral specialisation and foraging distances in solitary species.
- 7. The greater foraging distances in highly eusocial species suggests...
 - Physiological estimates are likely to overestimate foraging range...
 - In contrast, the shallow slope of functional estimates means that the majority of bee species forage within 403.4287935...
 - Functional ranges/distances rather physiological esimates should be used in conservation planning and crop pollinator management...

Introduction

Paragraph One: Ecological significance of foraging in terms of ecosystem function. Effects on foraging - landscape context etc -links to body size

Types of measurements Structure that feeder and homing as physiological measures - others as functional

Why should this be revisited? -Many more studies -new analytical methods -need to incorporate things like phylogeny etc

Research questions

- 1) How accurate is body size in predicting foraging distance in bees?
- 2) How do functional and physiological measurements of bee foraging distance/range scale allometrically?
- 3) Do the functional and physiological measurements of foraging distance differ between eusocial and solitary bee species?
- 4) Does floral specialisation affect foraging distances in solitary bee species?

Materials and Methods

To identify relevant publications for our review and meta-analysis, we first compiled foraging distance estimates from a previous meta-analysis by Greenleaf et al. 2007 and a review by Zurbuchen et al. 2010. We then undertook a systematic Scopus database search with the following search terms: TITLE-ABS-KEY (bee OR apoid*) AND (forag* AND distanc*) OR "flight range"). As of 12 March 2021, this returned 643 articles. We then subsetted this database to articles published post-2006 (to coincide with Greenleaf et al. 2007) and screened all articles for foraging distance estimates (n = 180 articles). We focussed solely on

female bee foraging patterns, excluding all studies that studied male and/or queen dispersal distances. From this search, we identified 114 articles. For each estimate, we defined the type of distances measured (maximum, typical or observed) and methodology used to measure foraging distance (see Table 1 for definitions), following Greenleaf et al. 2007.

Group	Type	Type2	Definition
Type of distance	Typical		Typical foraging distance was defined as the mean, median or mode
			foraging distance by a species within a study
	Maximum		Maximum foraging distance was defined as the maximum distance or
			distances observed within a experiment or study
	Observed		Observed foraging distances were those estaimtes that could not be
			defined as either typical or maximum distances. For example. AB
Method	Functional	Associative	Associative studies were those that measured foraging distance by
			associating known nests / hives and floral resources
		Mark-recapture	Mark-recapture
		Molecular	Molecular
		Tracking	Tracking
		Waggle dance	Dancing
	Physiological	Feeder	Feeder studies involved
		Homing	Homing studies

^{**}Table 1.** Types of bee foraging estimates and methodologies..

Species taxonomy and functional traits

We checked the validity of species' names using (Zach to fill X, Y, and Z). We then collected the following traits for each species: female body size (measured as the intertegular distance, Cane et al. 1987), level of eusociality and floral specialisation. We obtained body size from literature sources (i.e. pollimetry, brazilian trait dataset, traitbase) and by directly contacting researchers. Where multiple ITD measurements for a given species were found, we took the mean value. For eusocial species, where applicable, we obtained ITD measurements for the caste used within the study (i.e. workers or queens).

We delimited species into three levels of sociality: obligate solitary, primitively eusocial or highly eusocial. Obligate solitary species were those bee species that provision their own nest cells. This group includes species that live communally or in aggregations. Primitively eusocial species were those species that have non-permanent colonies and that are founded by a single female. This group included bumblebees Bombus species, as well as socially flexible Lasioglossum species, and those with overlapping generations e.g. Xylocopa species. Highly eusocial species were those species that had permanent colonies, which reproduce by budding. This group included all honeybees Apis species, and stingless bees (Meliponini).

Lastly, we grouped species, based on their level of floral specialisation, as either *oligolectic* or *polylectic*. Oligolectic speies were defined as those species who consistently collect pollen from a single plant species or group of similar or related plant species, even the presene of other pollen sources. Polylectic species were defined as those that use multiple, unrelated species for pollen.

Statistical analysis

All statistical analyses were undertaken in R (citation).

We used Bayesian generalized linear mixed effect models to analyze bee foraging distances as a function of body size and functional traits. We chose to use an un-weighted model as the vast majority of studies did not provide variance components for typical foraging distances. Further, the nature of maximum foraging distance (i.e. the largest distance observed within a species) is incompatible with a meta-analytical model as it lacks a definable variance. We modeled typical and maximum foraging distance separately. Observed foraging distances were excluded from analyses, as were all estimates with unknown metholodogy. As is typical in allometric studies, we log-transformed foraging distance prior to analyses. However, as intertegular distance is logarithmically related to body size (Cane et al. 1987; Kendall et al. 2019), we compared the predictive accuracy (\mathbb{R}^2) of models with and without log-transformed ITD. The raw ITD was considerably more predictive than $\ln(\mathrm{LTD})$, thus we present those models.

For these purposes we specified the following models (for both typical and maximum foraging distance): * 1) Distance ~ ITD * 2) Distance ~ ITD * Metric type (categorical, physiological or functional) * 3) Distance ~ ITD * Metric type * eusociality (categorical, three levels)

In addition, we also modelled distance \sim ITD * Lecty for solitary bees species.

For all models, the random effect structure consisted of random effects for i) publication, ii) a random intercept and slope for metric, iii) a phylogenetic effect, which consisted of a phylogenetic relatedness correlation matrix between bee genera and iv) a non-phylogenetic species level effect. For the phylogenetic effect, we constructed a bee phylogeny using an available bee genera tree (Hedtke, Patiny, & Danforth, 2013). We removed non-represented genera and then fitted a chronogram from this phylogeny by penalized likelihood, and a correlated rate model (Paradis et al. 2004). We then converted this to a phylogenetic correlation matrix.

We assessed the significance of the main- and interactive effects in each models by assessing whether 95% credible intervals bracketed zero. In the case of insignificant interactive effects in *Model 3*, we removed the interactions including eusociality (i.e. ITD * eusociality and Metric type * eusociality) and refitted a reduced model with eusociality as an addictive effect.

We parameterised each model with a Gaussian distribution, which was run for 2000 iterations, and a burn-in of 1000 iterations. We set weakly informative priors and manipulated Δ and maximum tree depth to avoid divergent transitions. We visualised posterior predictive checks using bayesplot (v1.6.0, Gabry & Mahr 2017) and assessed chain convergence for each sub-model separately. We considered effects were considered significant when 95% credible intervals did not bracket zero.

Results

Summary

In total, we included 352 estimates of foraging distance (typical, n = 159) & maximum, n = 193) in our analyses. We excluded 32 'observed' foraging distance estimates from analyses. Typical and maxmium foraging distance estimates included 78 species, 29 genera and 6 families. Honeybees Apis spp. (124 estimates) and bumblebees Bombus spp. (98 estimates) were the most commonly studied taxa. Maximum foraging distance estimates ranged from 83 metres ($Andrena\ hattorfiana$) to 23 kilometres ($Eufriesea\ surinamensis$). Typical foraging distance estimates ranged from 23.8 metres ($Bombus\ flavifrons$) to 7.5 kilometres ($Xylocopa\ virginica$).

ADD TABLE OF ESTIMATES -species summary

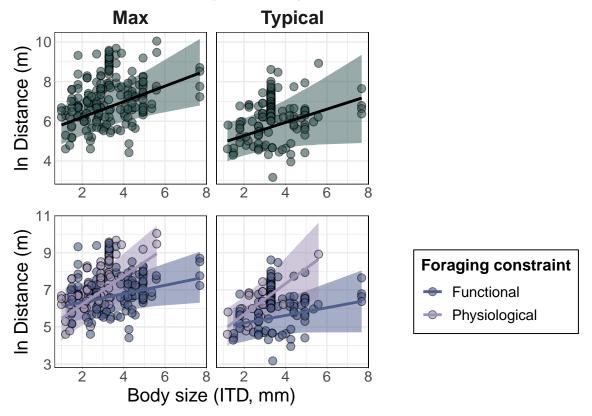


Figure 1: Relationship between bee foraging distance (log-transformed metres) and body size (ITD: intertegular distance). Top: Overall trend, bottom: type of measurement used to estimate foraging distance: physiological (feeder or homing experiments) or functional (other methods, see **Table 1**). Bold lines and ribbons indicate lines of best fit and corresponding 95% credible intervals. Circles denote raw data.

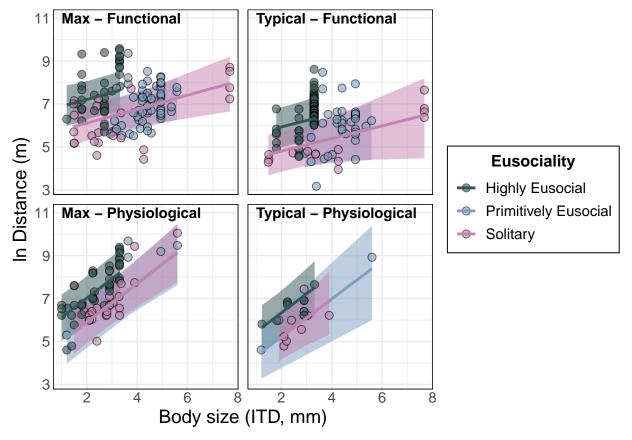


Figure 2: Relationship between physiological or functional bee foraging distances (log-transformed metres), body size (ITD) and eusociality. Bold lines and ribbons indicate lines of best fit and corresponding 95% credible intervals. Circles denote raw data.

##Allometry of foraging distance

Overall, body size was positively related to both maximum (Marginal $R^2 = 0.16$) and typical (Marginal $R^2 = 0.12$) foraging distances (Figure 1).

We found that physiological and functional constraints/measurements upon foraging distances differ in their relationship (slope) with body size (Model table, Figure 2). Specifically, physiological measurements of foraging distances increased at a greater rate per unit ITD than functional constraints/measurements (significant interaction with ITD, steeper slope). For example, in small bees (e.g. ITD of 2mm), physiological and functional measurements of foraging distance are similar (e.g. Typical: functional 182.37,physiological 290.44;Maximum: functional 564.3,physiological 502.57). However, in larger bees (ITD: 4mm), whereas physiological limits upon forging distance increase considerably, typical - 1522.51m, maximum - 2290.54m, functional limits do not: typical, 276.08m; maximum, 889.87m.

Eusociality was also highly important in structuring species differences in both functional and physiological bee foraging distances ($Marginal\ R^2$: Typical distance: 0.36, Maximum distance: 0.37. In particular, highly eusocial bees (Apis species and stingless bees (Tribe: Meliponini)) exhibited significantly higher physiological and functional foraging distances than either primitively eusocial or solitary species (MODEL TABLE of "max.euc.phylo.reduced.brm"). Primitively eusocial and solitary species exhibited near-identical foraging distance estimates. For example, a European honeybee $Apis\ mellifera$ (ITD:) is expected to have a physiological foraging distances of between 1778.52 and 3604.21m. In contrast, a primitively eusocial or solitary bee of the same size, such as $Osmia\ pedicornis$, is expected to have a physiological foraging distances of between 573.02 and 1193.93m.

We found no effect of floral specialization on either typical and maximum foraging distance in solitary bee

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species (See Table S7 & S8). Table SX-XX. Model tables Table S1. Mean distance ~ ITD model
```

```
## Family: gaussian
    Links: mu = identity; sigma = identity
## Formula: log.dist ~ ITD + (1 | Authors) + (ITD | Metric2) + (1 | spp) + (1 | gr(Genus, cov = Bg))
      Data: forage.traits.mean (Number of observations: 159)
## Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
            total post-warmup samples = 4000
##
##
## Group-Level Effects:
## ~Authors (Number of levels: 47)
##
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
                     0.53
                               0.11
                                        0.33
                                                  0.77 1.00
                                                                 940
                                                                          2086
## sd(Intercept)
## ~Genus (Number of levels: 17)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                     0.89
                               0.44
                                        0.11
                                                  1.81 1.00
                                                                1233
                                                                          1292
## ~Metric2 (Number of levels: 6)
##
                      Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
                                              0.01
                                                       1.28 1.00
                                                                      2731
## sd(Intercept)
                          0.42
                                    0.34
                                                                               2391
## sd(ITD)
                          0.28
                                    0.16
                                              0.06
                                                       0.67 1.00
                                                                     1195
                                                                               1417
## cor(Intercept,ITD)
                         -0.22
                                     0.57
                                             -0.98
                                                       0.91 1.00
                                                                      971
                                                                               1591
##
## ~spp (Number of levels: 47)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
##
## sd(Intercept)
                     0.46
                               0.11
                                        0.25
                                                  0.70 1.00
                                                                1188
                                                                          2051
##
## Population-Level Effects:
             Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## Intercept
                 4.60
                           0.59
                                    3.44
                                              5.73 1.00
                                                            3019
                                                                      2867
                 0.33
                                    -0.02
                                              0.68 1.00
                                                            2007
## ITD
                           0.18
                                                                      1992
##
## Family Specific Parameters:
         Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
                       0.03
                                0.39
                                          0.51 1.00
                                                        2661
             0.45
## sigma
## Samples were drawn using sample(hmc). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
Table S2. Max distance ~ ITD model
   Family: gaussian
    Links: mu = identity; sigma = identity
## Formula: log.dist ~ ITD + (1 | Authors) + (ITD | Metric2) + (1 | spp) + (1 | gr(Genus, cov = Ag))
      Data: forage.traits.max (Number of observations: 193)
## Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
            total post-warmup samples = 4000
##
## Group-Level Effects:
## ~Authors (Number of levels: 81)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
                               0.09
                                        0.39
                                                  0.73 1.01
                                                                          1849
## sd(Intercept)
                     0.55
                                                                1015
```

```
## ~Genus (Number of levels: 29)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
                               0.34
                                         0.61
                                                  1.95 1.00
                                                                 1509
                                                                          1731
## sd(Intercept)
                     1.21
## ~Metric2 (Number of levels: 7)
                      Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
## sd(Intercept)
                          0.70
                                     0.44
                                              0.05
                                                       1.72 1.00
## sd(ITD)
                          0.21
                                     0.13
                                              0.02
                                                       0.53 1.00
                                                                       627
                                                                                717
                                     0.54
                                             -0.94
                                                       0.89 1.00
## cor(Intercept,ITD)
                         -0.27
                                                                      1008
                                                                               1548
## ~spp (Number of levels: 78)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
                                0.08
## sd(Intercept)
                     0.39
                                         0.24
                                                  0.56 1.01
                                                                 1238
##
## Population-Level Effects:
             Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
                 5.41
                           0.56
                                     4.33
                                              6.53 1.00
                                                             2277
## Intercept
                 0.39
                           0.13
                                     0.12
                                              0.67 1.00
                                                            2226
                                                                      2578
## ITD
##
## Family Specific Parameters:
         Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
             0.51
                       0.04
                                0.43
                                          0.59 1.00
                                                        1084
                                                                  2115
## sigma
## Samples were drawn using sample(hmc). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
Table S3. Mean - metric type - distance model
  Family: gaussian
    Links: mu = identity; sigma = identity
## Formula: log.dist ~ ITD * limits + (1 | Authors) + (ITD | Metric2) + (1 | spp) + (1 | gr(Genus, cov
      Data: forage.traits.mean (Number of observations: 159)
## Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
##
            total post-warmup samples = 4000
##
## Group-Level Effects:
## ~Authors (Number of levels: 47)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
##
                     0.53
                                         0.34
                                                  0.75 1.00
                                                                 1214
                                                                          2336
## sd(Intercept)
                               0.10
## ~Genus (Number of levels: 17)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                     0.78
                               0.42
                                         0.06
                                                  1.66 1.00
                                                                 1172
                                                                          1480
## ~Metric2 (Number of levels: 6)
##
                      Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                          0.37
                                     0.30
                                              0.02
                                                       1.15 1.00
                                                                      2251
                                                                               1795
## sd(ITD)
                          0.14
                                     0.11
                                              0.01
                                                       0.43 1.00
                                                                      1332
                                                                               2001
## cor(Intercept,ITD)
                         -0.14
                                     0.58
                                             -0.96
                                                       0.93 1.00
                                                                      2152
                                                                               2404
##
## ~spp (Number of levels: 47)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                     0.46
                                0.11
                                         0.25
                                                  0.70 1.00
                                                                1133
```

```
##
## Population-Level Effects:
                    Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
                        4.79
                                   0.62
                                            3.55
                                                     5.95 1.00
                                                                    2524
                                                                             2833
## Intercept
## ITD
                         0.21
                                   0.14
                                           -0.07
                                                     0.50 1.00
                                                                    2213
                                                                             2463
                                                                    2890
                                                                             2837
## limitsphysio
                       -0.78
                                   0.67
                                           -2.11
                                                     0.53 1.00
## ITD:limitsphysio
                                   0.25
                         0.62
                                            0.13
                                                     1.10 1.00
                                                                    2593
                                                                             2242
## Family Specific Parameters:
##
         Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sigma
             0.44
                       0.03
                                 0.39
                                          0.51 1.00
                                                         2787
## Samples were drawn using sample(hmc). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
Table S4. Max - metric type - distance model
## Family: gaussian
    Links: mu = identity; sigma = identity
## Formula: log.dist ~ ITD * limits + (1 | Authors) + (ITD | Metric2) + (1 | spp) + (1 | gr(Genus, cov
      Data: forage.traits.max (Number of observations: 193)
## Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
            total post-warmup samples = 4000
##
##
## Group-Level Effects:
  ~Authors (Number of levels: 81)
##
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
                                         0.39
## sd(Intercept)
                     0.55
                                0.08
                                                  0.72 1.00
                                                                 1448
                                                                          2177
##
## ~Genus (Number of levels: 29)
##
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                     1.11
                                0.33
                                         0.55
                                                  1.86 1.00
                                                                 2009
                                                                          2696
##
## ~Metric2 (Number of levels: 7)
                      Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
                                     0.36
                                              0.24
                                                       1.63 1.00
                                                                      1628
## sd(Intercept)
                          0.76
                                                                               1863
## sd(ITD)
                           0.10
                                     0.09
                                              0.00
                                                       0.32 1.00
                                                                      1485
                                                                               1875
## cor(Intercept,ITD)
                         -0.37
                                     0.56
                                             -0.99
                                                       0.87 1.00
                                                                      2874
                                                                               2729
##
## ~spp (Number of levels: 78)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
## sd(Intercept)
                     0.38
                                0.08
                                         0.24
                                                  0.54 1.00
                                                                 1467
                                                                          2349
## Population-Level Effects:
                    Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## Intercept
                         5.88
                                   0.57
                                            4.74
                                                     7.01 1.00
                                                                    2904
                                                                             2772
## ITD
                        0.23
                                   0.12
                                           -0.00
                                                     0.45 1.00
                                                                    2884
                                                                             2792
## limitsphysio
                                           -2.45
                                                                             3004
                       -1.18
                                   0.64
                                                     0.08 1.00
                                                                    3319
## ITD:limitsphysio
                        0.53
                                   0.17
                                            0.20
                                                     0.86 1.00
                                                                    2688
                                                                             2776
## Family Specific Parameters:
         Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sigma
             0.50
                       0.04
                                 0.43
                                          0.59 1.00
                                                         1928
                                                                  2417
```

##

```
## Samples were drawn using sample(hmc). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
Table S5. Mean - metric type - eusociality distance model
## Family: gaussian
    Links: mu = identity; sigma = identity
## Formula: log.dist ~ ITD * limits + social_tree + (1 | Authors) + (ITD | Metric2) + (1 | spp) + (1 |
      Data: forage.traits.mean (Number of observations: 159)
## Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
           total post-warmup samples = 4000
##
## Group-Level Effects:
## ~Authors (Number of levels: 47)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                     0.49
                               0.10
                                         0.31
                                                  0.71 1.00
                                                                 1230
                                                                          2012
##
## ~Genus (Number of levels: 17)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                               0.34
                                        0.01
                                                  1.26 1.00
##
## ~Metric2 (Number of levels: 6)
                      Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
##
                                              0.02
                                                       1.23 1.00
## sd(Intercept)
                          0.40
                                    0.32
                                                                      2455
                                                                               2305
## sd(ITD)
                          0.16
                                    0.13
                                              0.01
                                                       0.51 1.00
                                                                      1185
                                                                               1831
## cor(Intercept,ITD)
                         -0.15
                                    0.58
                                             -0.97
                                                       0.92 1.00
                                                                      2035
                                                                               2643
## ~spp (Number of levels: 47)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                     0.44
                                0.11
                                         0.24
                                                  0.67 1.00
                                                                 1168
                                                                          1823
## Population-Level Effects:
                                   Estimate Est.Error 1-95% CI u-95% CI Rhat
## Intercept
                                       5.34
                                                 0.57
                                                          4.16
                                                                   6.47 1.00
## ITD
                                       0.30
                                                 0.15
                                                         -0.02
                                                                    0.58 1.00
## limitsphysio
                                      -0.78
                                                         -2.02
                                                 0.64
                                                                   0.48 1.00
## social_treePrimitivelyEusocial
                                      -1.12
                                                 0.40
                                                         -1.88
                                                                  -0.30 1.00
## social_treeSolitary
                                      -1.13
                                                 0.39
                                                         -1.88
                                                                  -0.38 1.00
## ITD:limitsphysio
                                       0.59
                                                          0.05
                                                                    1.07 1.00
                                                 0.25
##
                                   Bulk_ESS Tail_ESS
## Intercept
                                       2526
                                                2421
## ITD
                                       1955
                                                2093
## limitsphysio
                                       3040
                                                2981
## social_treePrimitivelyEusocial
                                       2588
                                                2744
## social_treeSolitary
                                       2584
                                                2667
## ITD:limitsphysio
                                       2089
                                                2327
## Family Specific Parameters:
         Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
                       0.03
                                0.39
                                         0.51 1.00
##
## Samples were drawn using sample(hmc). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
```

scale reduction factor on split chains (at convergence, Rhat = 1).

Table S6. Max- metric type - eusociality distance model

```
## Family: gaussian
    Links: mu = identity; sigma = identity
\#\# Formula: log.dist ~ ITD * limits + social_tree + (1 | Authors) + (ITD | Metric2) + (1 | spp) + (1 | spp)
      Data: forage.traits.max (Number of observations: 193)
## Samples: 4 chains, each with iter = 2000; warmup = 1000; thin = 1;
##
            total post-warmup samples = 4000
## Group-Level Effects:
## ~Authors (Number of levels: 81)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                     0.57
                                0.08
                                         0.41
                                                  0.74 1.00
                                                                 1280
                                                                          2034
##
## ~Genus (Number of levels: 29)
##
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
                                         0.03
                                                  1.22 1.00
## sd(Intercept)
                     0.47
                                0.32
## ~Metric2 (Number of levels: 7)
                      Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
##
## sd(Intercept)
                          0.74
                                     0.35
                                              0.24
                                                       1.60 1.00
                                                                      1254
                                                                               1038
## sd(ITD)
                                     0.08
                                              0.00
                                                       0.30 1.00
                                                                               2133
                          0.10
                                                                      1770
## cor(Intercept,ITD)
                         -0.36
                                     0.56
                                             -0.99
                                                       0.87 1.00
                                                                      2494
                                                                               2772
## ~spp (Number of levels: 78)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
                     0.38
                                0.08
                                         0.23
                                                  0.54 1.00
                                                                 1257
                                                                          2236
## sd(Intercept)
## Population-Level Effects:
                                   Estimate Est.Error 1-95% CI u-95% CI Rhat
## Intercept
                                       6.56
                                                 0.54
                                                          5.47
                                                                   7.60 1.00
## ITD
                                       0.33
                                                 0.11
                                                          0.10
                                                                    0.55 1.00
## limitsphysio
                                      -1.34
                                                 0.62
                                                         -2.61
                                                                  -0.14 1.00
## social_treePrimitivelyEusocial
                                      -1.13
                                                 0.33
                                                         -1.76
                                                                  -0.47 1.00
## social_treeSolitary
                                                 0.32
                                                         -1.69
                                                                   -0.43 1.00
                                      -1.10
                                                          0.26
                                                                    0.88 1.00
## ITD:limitsphysio
                                       0.57
                                                 0.16
##
                                   Bulk_ESS Tail_ESS
## Intercept
                                       2387
                                                2577
                                       2822
## ITD
                                                2543
## limitsphysio
                                       3038
                                                2611
## social treePrimitivelyEusocial
                                       2819
                                                2969
## social_treeSolitary
                                       2560
                                                2973
## ITD:limitsphysio
                                       2768
                                                2428
##
## Family Specific Parameters:
         Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
                       0.04
                                0.43
                                         0.58 1.00
##
## Samples were drawn using sample(hmc). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
```

Table S7. Mean - lecty distance model

```
## Family: gaussian
```

```
Links: mu = identity; sigma = identity
## Formula: log.dist ~ ITD * Lecty + (ITD | Metric2) + (1 | Authors) + (1 | spp) + (1 | gr(Genus, cov =
      Data: forage.traits.mean.sol (Number of observations: 24)
## Samples: 4 chains, each with iter = 4000; warmup = 2000; thin = 1;
##
            total post-warmup samples = 8000
##
## Group-Level Effects:
## ~Authors (Number of levels: 9)
##
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
                                0.30
## sd(Intercept)
                     0.40
                                         0.02
                                                  1.11 1.00
                                                                 3176
                                                                          4704
## ~Genus (Number of levels: 10)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
                     0.75
## sd(Intercept)
                                0.43
                                         0.05
                                                  1.70 1.00
                                                                 2668
                                                                          2822
##
## ~Metric2 (Number of levels: 3)
##
                      Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                           0.72
                                     0.54
                                              0.03
                                                        2.02 1.00
                                                                      6183
                                                                                3895
                           0.47
                                     0.37
                                              0.03
                                                        1.44 1.00
                                                                      3023
                                                                               4171
## sd(ITD)
## cor(Intercept,ITD)
                           0.01
                                     0.57
                                             -0.94
                                                        0.95 1.00
                                                                      4452
                                                                               4963
##
## ~spp (Number of levels: 17)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
##
                                         0.00
                                                  0.53 1.00
## sd(Intercept)
                     0.16
                                0.14
                                                                 4377
##
## Population-Level Effects:
                        Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS
## Intercept
                                                1.64
                             4.08
                                       1.19
                                                          6.38 1.00
                                                                        5309
                             0.30
                                       0.40
                                               -0.60
                                                          1.03 1.00
                                                                        2964
## ITD
## LectyOligolectic
                             0.04
                                       1.14
                                               -2.22
                                                          2.22 1.00
                                                                        3082
## ITD:LectyOligolectic
                             0.05
                                       0.42
                                               -0.75
                                                          0.87 1.00
                                                                        3021
##
                        Tail_ESS
## Intercept
                             5198
                             3001
## ITD
## LectyOligolectic
                             4438
## ITD:LectyOligolectic
                             4051
##
## Family Specific Parameters:
         Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
##
             0.40
                       0.09
                                 0.26
                                          0.61 1.00
                                                         4103
## sigma
## Samples were drawn using sample(hmc). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
Table S8. Max - lecty distance model
    Family: gaussian
     Links: mu = identity; sigma = identity
## Formula: log.dist ~ ITD * Lecty + (ITD | Metric2) + (1 | Authors) + (1 | spp) + (1 | gr(Genus, cov =
      Data: forage.traits.max.sol (Number of observations: 48)
## Samples: 4 chains, each with iter = 4000; warmup = 2000; thin = 1;
            total post-warmup samples = 8000
##
##
## Group-Level Effects:
```

```
## ~Authors (Number of levels: 26)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
##
                               0.20
                                         0.44
                                                  1.27 1.00
## sd(Intercept)
                     0.84
                                                                 2114
##
## ~Genus (Number of levels: 16)
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS Tail ESS
## sd(Intercept)
                     0.49
                               0.39
                                         0.02
                                                  1.46 1.00
                                                                 2320
                                                                          3831
##
## ~Metric2 (Number of levels: 4)
##
                      Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
## sd(Intercept)
                           0.54
                                     0.43
                                              0.02
                                                        1.61 1.00
                                                                      5568
                                                                                4312
                           0.34
                                     0.26
                                              0.03
                                                        1.00 1.00
                                                                      2271
                                                                               2867
## sd(ITD)
                                     0.57
                                             -0.96
                                                       0.93 1.00
## cor(Intercept,ITD)
                         -0.09
                                                                      4157
                                                                               4917
##
## ~spp (Number of levels: 28)
##
                 Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
                                0.14
                                         0.01
                                                  0.52 1.00
                                                                 2790
                                                                          3986
## sd(Intercept)
                     0.18
##
## Population-Level Effects:
                        Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk ESS
## Intercept
                             4.88
                                       0.91
                                                3.03
                                                         6.71 1.00
                                                                        4940
## ITD
                             0.49
                                       0.29
                                               -0.11
                                                         1.03 1.00
                                                                        3744
## LectyOligolectic
                                       0.98
                                               -1.08
                                                         2.78 1.00
                             0.86
                                                                        4192
## ITD:LectyOligolectic
                           -0.42
                                       0.36
                                               -1.13
                                                         0.30 1.00
                                                                        4333
##
                        Tail ESS
## Intercept
                             5522
## ITD
                             4014
## LectyOligolectic
                             5094
## ITD:LectyOligolectic
                             5100
##
## Family Specific Parameters:
##
         Estimate Est.Error 1-95% CI u-95% CI Rhat Bulk_ESS Tail_ESS
             0.48
                       0.09
                                 0.33
                                          0.70 1.00
                                                         1876
## sigma
                                                                  2831
##
## Samples were drawn using sample(hmc). For each parameter, Bulk_ESS
## and Tail_ESS are effective sample size measures, and Rhat is the potential
## scale reduction factor on split chains (at convergence, Rhat = 1).
```

Discussion