

# The evolution of reproductive strategies in turtles

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The recorded variation in traits in the egg and clutch among amniotes has led to the idea of an “optimal egg strategy” based on trade-offs, and to hypotheses about general trends. Here we perform an analysis comprising all big clades of living turtles to examine egg and clutch diversity. We include at least one representative of all extant turtle genera. Our goal is to investigate if there are actual trends for reproductive strategies among turtles and to identify factors that influence clutch and egg traits in this amniote clade. Our hypothesis is that turtles have reproductive trends that do not necessarily follow a monophyletic distribution but evolved convergently and in association with specific clades. There are local “optima” correlations between some traits and convergences across phylogeny.

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## 13 Abstract

14 The recorded variation in traits in the egg and clutch among amniotes has led to the idea of an  
15 “optimal egg strategy” based on trade-offs, and to hypotheses about general trends. Here we  
16 perform an analysis comprising all big clades of living turtles to examine egg and clutch  
17 diversity. We include at least one representative of all extant turtle genera. Our goal is to  
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19 factors that influence clutch and egg traits in this amniote clade. Our hypothesis is that turtles  
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21 convergently and in association with specific clades. There are local “optima” correlations  
22 between some traits and convergences across phylogeny.

23

## 24 Introduction

25 Macroevolution researchers have focused in many aspects of the diversity of life, including the  
26 study of reproductive patterns of amniotes (Battistella et al., 2019; Murray et al., 2020), that can  
27 be approached by investigating the diversity of traits in the egg and clutch (e.g., Kaplan and  
28 Salthe 1979; Deeming and Birchard, 2007; Jetz et al., 2008; Deeming and Ruta, 2014).

29 The idea of an “optimal” egg/clutch-strategy based on trade-offs, similar to K/r strategies, have  
30 led to several yet inconclusive discussions (Congdon and Gibbons 1987; Elgar and Heaphy  
31 1989; Godfray et al., 1991; Kuchling, 1999; Li et al., 2017; Yu and Deng, 2020). Optimal  
32 egg/clutch size theory assumes that changes of phenotypic traits of oviposition strategies are  
33 driven by selection, that results in the best adjustments for the production of the biggest number  
34 of offspring with the highest fitness and the lowest resource investment by their progenitors as  
35 possible (Brockelman, 1975; Congdon and Gibbons, 1987).

36 Turtles offer a rich subject of investigation given the ecological diversity of this group in which  
37 all species lay eggs. Studies focused on turtles have tested many correlations between egg size  
38 and both morphological and ecological traits in an effort to explain the variation among species  
39 (Elgar and Heaphy, 1989; Iverson, 1992; Iverson et al., 1993; Rowe, 1994). Some authors have  
40 argued that the “optimum” egg size is determined by adult body size (Gibbons, 1982); pelvic  
41 aperture morphology (Congdon and Gibbons, 1987; Kuchling, 1999), environmental factors  
42 (Macip-Ríos et al., 2013) and/or physiology (Bowden et al., 2004). These hypotheses have been  
43 largely based on studies of straight correlations of traits (Gibbons, 1982); methods that take  
44 phylogeny into account would provide a test to them.

45 Available evidence supports the idea that big bodied animals tend to produce bigger clutches  
46 with small and round eggs (Fig. 1A) while smaller species produce small clutches with big and  
47 elongated eggs (Fig. 1B), from now on referred as reproductive strategies. Elgar and Heaphy  
48 (1989) proposed that spherical eggs are less susceptible to desiccation as the surface/volume  
49 ratio is smaller in comparison to elongated eggs. On the other hand, Pritchard (1979) suggested  
50 that small species have a tendency to produce bigger and elongated eggs because a small  
51 spherical egg would not be capable of producing a functional hatchling as there is not enough  
52 space available and that adult body size is a constraint for the egg width. Moll (1979) argued that

53 spherical eggs are more efficient in occupying limited spaces, therefore larger clutches are  
54 supposed to have more spherical eggs.

55 Although general trends have been identified, a comprehensive analysis comprising all ~~big~~  
56 clades of living turtles in order to explore egg and clutch diversity is still missing. In this study  
57 we present ~~several~~ analyzes based on data taken from the literature for at least one representative  
58 of all extant turtle genera. Our goal is to examine if there are trends for reproductive strategies  
59 among turtles and investigate potential factors that influence clutch and egg traits in this clade.  
60 We address the following questions: 1) How do reproductive traits (such as egg size, egg shape,  
61 and clutch size) relate to each other within and among turtle clades? 2) How are these  
62 reproductive characteristics distributed along turtle phylogeny? 3) Are there “optimal”  
63 reproductive strategies? 4) What are the factors that most influence reproductive strategies  
64 among turtles? 5) Are there differences on egg/clutch size among turtle families? We  
65 hypothesize that although there is variation and ecological factors may affect reproductive traits,  
66 these are largely conserved within clades.

67

## 68 Materials & Methods

69 We collected morphological, ecological and reproductive data for at least one species of each  
70 turtle genus (Table 1; Supplemental Information, Appendix S1) using available literature  
71 (Supplemental Information, Appendix S2). All statistical and exploratory analyses were  
72 conducted in R 3.2.1 (R Core Team 2016; scripts and input files available on Supplemental  
73 Information, Appendix S3).

74 Exploratory analysis

75 We performed a principal component analysis (PCA) in order to test the correlations among  
76 reproductive parameters (e.g., egg size, egg length, adult body size) commonly tested in previous  
77 works with smaller datasets (Elgar and Heaphy, 1989; Iverson, 1992; Iverson et al., 1993; Rowe,  
78 1994). Also, in order to evaluate the impact of phylogenetic relationships over these correlations,  
79 we performed a phylogenetic PCA. We used the functions imputePCA (package missMDA;  
80 Josse and Husson, 2016) and phyl.pca (package phytools; Revell, 2012) respectively.

81 For the phylogenetic PCA, we used a super tree reconstructed in Mesquite v. 3.51 (Maddison &  
82 Maddison, 2019), including the same taxa as in the database. We followed the phylogenetic  
83 hypothesis proposed by Pereira et al. (2017) for the backbone of our tree—which is the  
84 hypothesis with the denser taxonomic sampling available—and positioned other species based on  
85 other phylogenetic hypotheses: Pelomedusidae (Fritz et al., 2011); Podocnemididae (Vargas-  
86 Ramirez et al., 2008; Guillon et al., 2012); Chelidae (Georges et al., 2002; Vargas-Ramirez et al.,  
87 2012; Le et al., 2013; Zhang et al., 2017); Geoemydidae (Le et al., 2007; Guillon et al., 2012;  
88 Pereira et al., 2017); Testudinidae (Pereira et al., 2017); Emydidae (Fritz et al., 2012; Pereira et  
89 al., 2017; Thomson et al., 2018); and Kinosternidae (Iverson et al., 2013).

90 The resulting topology was used to map characters related to reproductive traits using the  
91 contMap function of phytools package (Revell, 2012). This analysis was run three times, using



92 respectively the following characters: 1) Egg size (ESI): egg length/carapace length; 2) Egg  
93 shape (ESH): egg length/egg width; and Fecundity (FEC): maximum number of eggs in a clutch.  
94 We also used the phytools package to perform a multivariate analysis using the function  
95 phylomorphospace3d, in order to reconstruct the morphospace — which can be defined as the  
96 multidimensional distribution of an organism's phenotype (Lloyd, 2018). The incorporation of  
97 phylogenetic information (tree topology) provides not only information on phenotypes  
98 disparities, but also on the transformation from ancestral to derived conditions, leading to a  
99 phylomorphospace (Gerber, 2019) — for turtle phylogeny based on the former proposed  
100 characters (ESI, ESH and FEC) as axis. The 3D visualization can be accessed following the R  
101 script available on the Supplemental Information (Appendix S3).

## 102 Explanatory analysis

103 In order to address different aspects of reproductive strategies among turtles, we ran two  
104 different model selections. In the first one, we used the square root values of the ESI variable as  
105 the dependent variable (egg size) to test how the selected independent variables predicted the  
106 size of the egg among species (egg size selection). In the second model selection, we used the  
107 maximum number of eggs laid in one clutch times the mean number of clutches per year as a  
108 proxy for fecundity, to address how the selected independent variables predicted the fecundity of  
109 turtle species (fecundity selection).

110 For the first model selection, we used a dataset containing at least one representative of each  
111 genus with a total of 230 species sampled. For the second model selection, we sampled a total of  
112 177 species; the monotypic genus *Notochelys* (Gray, 1863) was the only one not included due to  
113 lack of information on number of clutches per year.

114 We used maximum likelihood to fit general linear mixed models (GLMMs) with Gaussian  
115 distribution for the egg size model selection, with egg size as the dependent variable and built  
116 every possible combination of models for the five independent variables, without interactions  
117 (Table 1). The final set models of the egg size selection contained 31 candidate models besides  
118 the null model. The fecundity model selection was performed using maximum likelihood to fit  
119 generalized linear mixed models (GLMMs) with log-normal distribution. We used the fecundity  
120 as the dependent variable and built every possible combination of models for the four  
121 independent variables, without interactions (Table 1; Clutch Size was not included). The final set  
122 of candidate models contained 15 candidate models besides the null model. The information  
123 about the family each species belongs to was treated as a random effect in all models (1|family),  
124 because preliminary analyses show that closed related species have similar egg size and  
125 fecundity (ANOVA  $p < 0.0001$ ).

126 Model selections were performed using the function dredge of the MuMIn package (Bartoń,  
127 2015). We ran an all-subset model selection and ranked the models based on Akaike's  
128 Information Criterion corrected for small sample size (AICc; Burnham and Anderson, 2002;  
129 Symonds and Moussalli, 2011) with the best-supported model having the lowest AICc.  
130 When there was no single model strongly supported (Akaike weight  $> 0.9$ ) we calculated the  
131 evidence ratio for the best-supported models (Burnham and Anderson 2002; Johnson and



132 Omland 2004) and used multimodel inference to understand how independent variables predict  
133 the reproductive trait in turtles (Burnham and Anderson 2002; Johnson and Omland 2004;  
134 Burnham et al. 2011; Symonds and Moussalli 2011). We used all the candidate models for full  
135 model averaging and calculated the relative importance of each independent variable and their  
136 respective confidence intervals (85%).  
137

## 138 Results

139 Regular and phylogenetic PCAs (Fig. 2A and B) showed similar correlations among inputs. In  
140 both cases, there is a positive correlation between egg size characters (length, width and weight),  
141 and a negative correlation between egg size and clutch size. The size of adult animals (e.g.,  
142 carapace length) have little influence over other parameters, with a weak negative correlation  
143 with egg weight present only in the regular PCA. Number of clutches per year is the most  
144 divergent parameter when comparing both analyzes.

145 The contMap analysis (Fig. 3A, B and C) allows the easy visualization of characters distribution  
146 within the phylogeny. Through the comparison of the plotted trees, it is possible to correlate  
147 small and round eggs to species that produce bigger clutches. Such traits evolved independently  
148 in several not-directly related families (e.g., Podocnemididae, Cheloniidae, Dermochelyidae,  
149 Chelydridae) or even only in bigger bodied representatives in some families (e.g., Testudinidae,  
150 Trionychidae). This pattern is also recovered in the phylomorphospace analysis (available on  
151 Supplemental Information Fig. S1 on its static view). Species with extreme characters  
152 distribution are easily visualized (e.g., *Geoemyda spengleri* and *Glyptemys muhlenbergii* – low  
153 FEC, high ESH and ESI; *Lepidochelys olivacea* and *Podocnemis expansa* – high FEC, low ESH  
154 and ESI). Although it is possible to visualize some groups of species that fit in “clusters” of  
155 extreme character-distribution in the phylomorphospace analysis, most species were positioned  
156 close to each other, with average values for all the three characters.

157 In the egg size model selection, only the best-ranked model (Clutch Size + Habitat) was selected  
158 as a plausible model ( $\Delta\text{AICc} < 6$ ; weight = 0.979; Likelihood Ratio Test  $< 0.001$ ; Table 2). The  
159 model predicts that the size of the egg in relation to body size decreases with the increase of the  
160 mean number of eggs per clutch, and that aquatic and oceanic species of turtles have smaller  
161 eggs than terrestrial and semi-aquatic species, respectively (Fig. 4).

162 In the fecundity model selection, three of the 16 candidate models were selected as best-  
163 supported models ( $\Delta\text{AICc} < 6$ ; accumulated weight = 98.6%; Table 3). As the first supported  
164 model only accounted for 68% of the variation (Table 3), we used all 16 models for multimodel  
165 inference through model averaging to calculate the relative importance of each variable to  
166 turtle’s fecundity (Table 4). Both habitat and diet were the most important factors to predict  
167 turtle fecundity (RI = 1.00). Low relative importance values and confidence intervals including  
168 zeros suggest that climatic zone and zoogeography are not good predictors for fecundity.

169

## 170 Discussion

171 The evolutionary history of turtles is marked by a complex pattern of character evolution



172 regarding breeding biology. The hypothesis that big bodied turtles tend to produce big clutches  
173 with comparatively smaller and rounder eggs (group 1) while small bodied species produce small  
174 clutches with larger and more elongated eggs (group 2) is supported by the patterns observed in  
175 the PCA analysis, by the contMap analysis and by the egg size model selection.  
176 Evolutionary patterns (evidenced by different colors) in all of the three contMap analyzes tend to  
177 interact to each other, suggesting a correlation between the tested characters. These patterns  
178 evolved independently and recurrently along the diversification of turtles. This shows that during  
179 its evolutionary history, turtles explored different reproductive strategies with several instances  
180 of convergent evolution.  
181 Although no clear “optimum” reproductive strategy clusters are formed on the  
182 phylomorphospace analysis plot, extreme examples of each of the proposed groups are visible  
183 (e.g., *Geoemyda spengleri* and *Lepidochelys olivacea*, as representatives of groups 2 and 1,  
184 respectively). The difference on scale of character FEC might be partially responsible for the  
185 poor visualization, as most species colonized the same portion of the morphospace (bottom of  
186 the Y axis). Nevertheless, even discarding this bias, most species would still be clustered in the  
187 middle of the plot as they show average values of both ESH and ESI.  
188 One could either argue that there is a third “optimum” cluster of reproductive strategy with  
189 average values or that there are no clusters at all. We advocate that there are major trends on  
190 turtle reproductive strategies that one could call “optimum constraints”, although they seem to be  
191 somewhat relaxed as all reproductive characters are continuous, without any clear break in  
192 patterns, especially in the case of average values, where most species are clustered.  
193 As noticed by Elgar and Heaphy (1989: 137), “Terrestrial species lay fewer and larger eggs for  
194 their size than freshwater or marine species, but this association is statistically confounded by the  
195 fact that chelonian families form ecological groups”. The convergent distribution of reproductive  
196 traits and the different modifications of these traits across families that occupy unique niches,  
197 such as Testudinidae that lives in land and Cheloniidae/Dermochelyidae that lives in the ocean,  
198 can be considered evidence for adaptation of an “optimal” reproductive strategy at a specific  
199 environment or a constrain of specific clades. Although asserting the adaptive value of these  
200 traits can be difficult (see Kluge 2005), the fact that the evolution of these strategies is correlated  
201 with the colonization of new environments, provides strong support for a heuristic postulation of  
202 its adaptive value (Kluge 2005; Losos 2011). Furthermore, our model selection analysis for egg  
203 size (Fig. 4) not only corroborates the patterns described by Elgar and Heaphy (1989), but also  
204 brings light to the fact that this pattern is not statistically confounded by chelonian families  
205 forming ecological groups, since we used “family” as a random factor.  
206 On the model selection analysis, the “semi-aquatic” group presents slightly bigger relative egg  
207 size when compared to the terrestrial species that belong to the Testudinidae (Fig. 4; blue and  
208 green lines, respectively). Both groups present bigger relative egg size when compared to  
209 oceanic and aquatic species (Fig. 4; red and black lines, respectively). This is evidence that  
210 “optimal” reproductive strategies are not correlated to species’ phylogenetic distribution  
211 (although close related species tend to have similar strategies), but related to their

212 life/reproductive strategies that converged in different clades. The model selection for fecundity  
213 indicates habitat and diet as the most influential characters, highlighting the importance of life  
214 history traits for reproductive strategy selection.

215

## 216 **Conclusions**

217 Little is known about many aspects of the reproductive behavior within Testudines, and some of  
218 them might have a direct correlation with clutch/egg size. As Nussbaum (1987: 38) stated: “The  
219 safe harbor hypothesis includes the suggestion that parental care causes the embryonic stage to  
220 be the safest harbor, and, therefore, egg size will increase in populations with parental care to  
221 decrease the duration of subsequent, higher risk stages”. Many species of the Testudinidae are  
222 known to care for their eggs (Agha et al., 2013), making the safe harbor hypothesis a good  
223 explanation for the comparatively big eggs and, maybe consequently, smaller clutches in this  
224 family. Other clades of turtles have historically been considered to lack any forms of parental  
225 care, but now we have evidence of the opposite (Ferrara et al., 2013). *Podocnemis expansa* is a  
226 good example of “group 1” reproductive strategy, being the biggest South American freshwater  
227 turtle and producing many small round eggs in a clutch. In this case, the only described parental  
228 care behavior starts after the eggs hatch, providing the safe harbor hypothesis only weak  
229 explanatory power. Other factors probably have bigger influence in this case, such as Elgar and  
230 Heaphy’s (1989) proposition that round eggs should suffer less from desiccation.  
231 Reproductive traits in Testudines evolved independently several times across tree in non-directly  
232 related clades, which can be considered an evidence of convergence, and an argument to endorse  
233 the existence of adaptive evolution and constraints in reproductive biology, frequently referred as  
234 “optimum” reproductive constrains.

235

## 236 **Acknowledgements**

237 Dr. Richard Vogt provided important literature on egg/clutch diversity. Danilo Muniz and Diogo  
238 Melo helped with statistics.

239

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339 things). *Methods in ecology and evolution*, 3(2), pp.217-223.
- 340 Rowe, J.W., 1994. Egg size and shape variation within and among Nebraskan painted turtle  
341 (*Chrysemys picta bellii*) populations: relationships to clutch and maternal body size. *Copeia*,  
342 pp.1034-1040.
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345 *Behavioral Ecology and Sociobiology* 65:13–21.
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347 the map turtles (Emydidae: *Graptemys*). *Molecular phylogenetics and evolution*, 121, pp.61-70.
- 348 Vargas-Ramírez, M., Castaño-Mora, O.V. and Fritz, U., 2008. Molecular phylogeny and  
349 divergence times of ancient South American and Malagasy river turtles (Testudines: Pleurodira:  
350 Podocnemididae). *Organisms Diversity & Evolution*, 8(5), pp.388-398.
- 351 Vargas-Ramírez, M., Michels, J., Castaño-Mora, O.V., Cárdenas-Arevalo, G., Gallego-García,  
352 N. and Fritz, U., 2012. Weak genetic divergence between the two South American toad-headed  
353 turtles *Mesoclemmys dahli* and *M. zuliae* (Testudines: Pleurodira: Chelidae). *Amphibia-Reptilia*,  
354 33(3-4), pp.373-385.
- 355 Yu, T.L. and Deng, Y.H., 2020. Geographic variation in maternal investment and trade-offs  
356 between egg size and clutch size in an endemic toad of the Qinghai-Tibet plateau. *Scientific  
357 Reports*, 10(1), pp.1-8.
- 358 Zhang, X., Unmack, P.J., Kuchling, G., Wang, Y. and Georges, A., 2017. Resolution of the  
359 enigmatic phylogenetic relationship of the critically endangered Western Swamp Tortoise  
360 (*Pseudemydura umbrina* (Pleurodira: Chelidae) using a complete mitochondrial genome.  
361 *Molecular phylogenetics and evolution*, 115, pp.58-61.

**Table 1**(on next page)

Set of variables included as predictors for variability in each candidate models for model selections

Clutch Size was included only in the ESI selection

1

Variables	Description
Climatic Zone	Climatic zone of distribution (Tropical / Temperate)
Clutch Size	Mean number of eggs per clutch
Diet	Diet type (Carnivore / Herbivore / Omnivore)
Habitat	Main type of habitat (Aquatic / Oceanic / Semi-aquatic / Terrestrial)
Zoogeography	Zoogeographical region of distribution

2

3 **TABLE 1. Set of variables included as predictors for variability in each candidate models for  
4 model selections.**

5 Clutch Size was included only in the ESI selection.

6

**Table 2**(on next page)

Coefficients, standard errors, and the 85% confidence interval of the best-support model (Clutch Size + Habitat) in the egg size selection

CI = Confidence interval

1

Variable	Coefficient	Standard Error	Lower CI	Upper CI
Clutch Size	-0.002	0.0003	-0.003	-0.002
Habitat-Aquatic	0.393	0.0190	0.351	0.431
Habitat-Oceanic	0.356	0.0588	-0.084	0.155
Habitat-Semi Aquatic	0.278	0.0338	0.049	0.182
Habitat-Terrestrial	0.289	0.0201	0.064	0.144

2

3 **TABLE 2. Coefficients, standard errors, and the 85% confidence interval of the best-**

4 **support model (Clutch Size + Habitat) in the egg size selection.**

5 CI = Confidence interval.

**Table 3**(on next page)

Best-supported models ( <!--[if !msEquation]--> <!--[if !vml]--> <!--[endif]--><!-- [endif]-->AIC<sub>c</sub> < 6) predicting fecundity for turtle species

Models are ranked from the lowest to the highest Akaike's Information Criterion corrected for small sample size (AIC<sub>c</sub>). See Table 1 for description of the variables

1

Model	df	logLik	AIC <sub>c</sub>	ΔAIC <sub>c</sub>	weight	Evidence Ratio
Diet + Habitat	8	-983.403	1983.7	0.00	0.687	-
Diet + Habitat + Climatic Zone	9	-983.383	1985.8	2.18	0.231	2.97
Diet + Habitat + Zoogeography	13	-980.024	1988.3	4.62	0.068	10.07

2

3 **TABLE 3. Best-supported models ( $\Delta\text{AIC}_c < 6$ ) predicting fecundity in turtle species.**

4 Models are ranked from the lowest to the highest Akaike's Information Criterion corrected for  
5 small sample size (AIC<sub>c</sub>). See Table 1 for description of the variables.

6

**Table 4**(on next page)

Relative importance of variables predicting fecundity for turtle species

1

Variable	Relative Importance
Habitat	1.00
Diet	1.00
Climatic Zone	0.24
Zoogeography	0.08

2

3 **TABLE 4. Relative importance for variables predicting fecundity on turtle species.**

4

# Figure 1

Different egg and clutch strategies

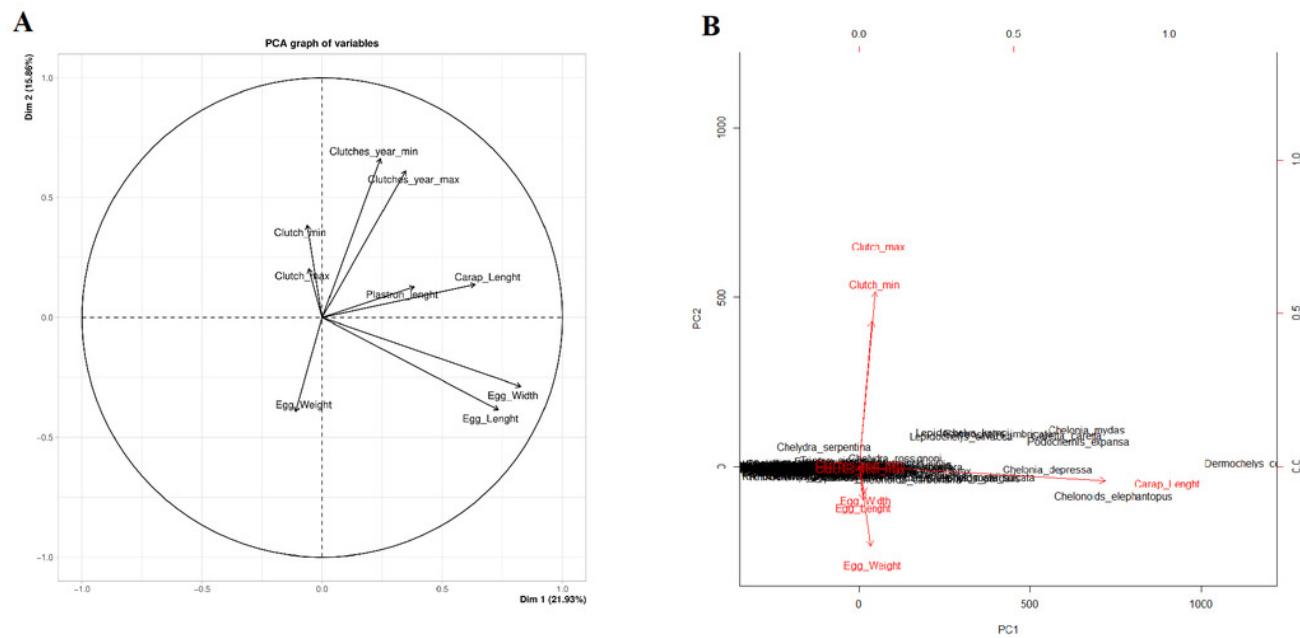
A) Nest of the giant Amazon river turtle (*Podocnemis expansa*) with many small round eggs; and B) Small clutch with big and elongated eggs of the South American wood turtle (*Rhinoclemmys punctularia*). The carapace length of these species reaches over one meter and 25cm long, respectively.



## Figure 2

Correlations among reproductive and body size characteristics of turtles

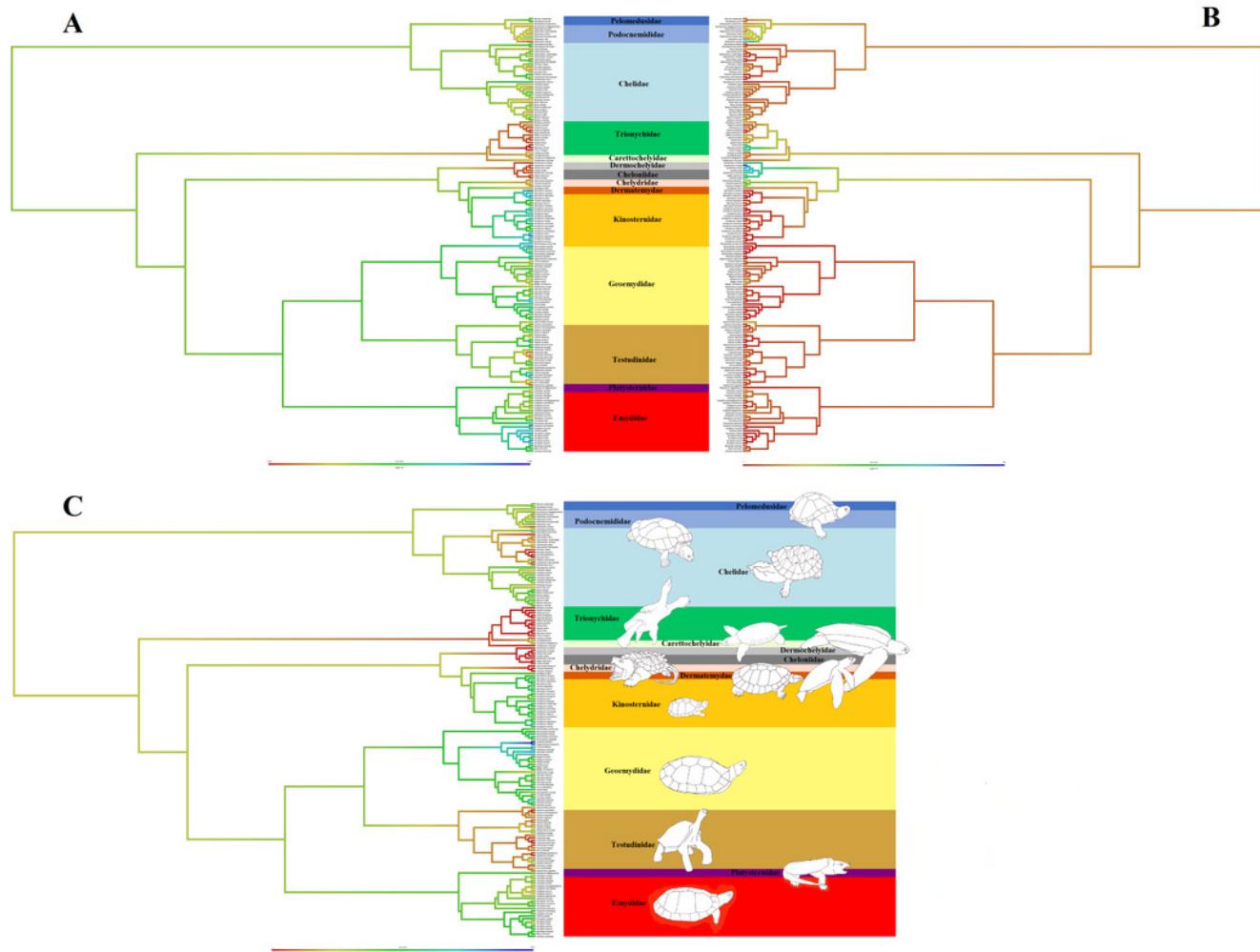
A) Principal component analysis (PCA) and B) Phylogenetic PCA (PhyPCA). Plastron length was not used on the PhyPCA.



# Figure 3

Phylogenetic distribution of Testudines' reproductive characteristics using contMap

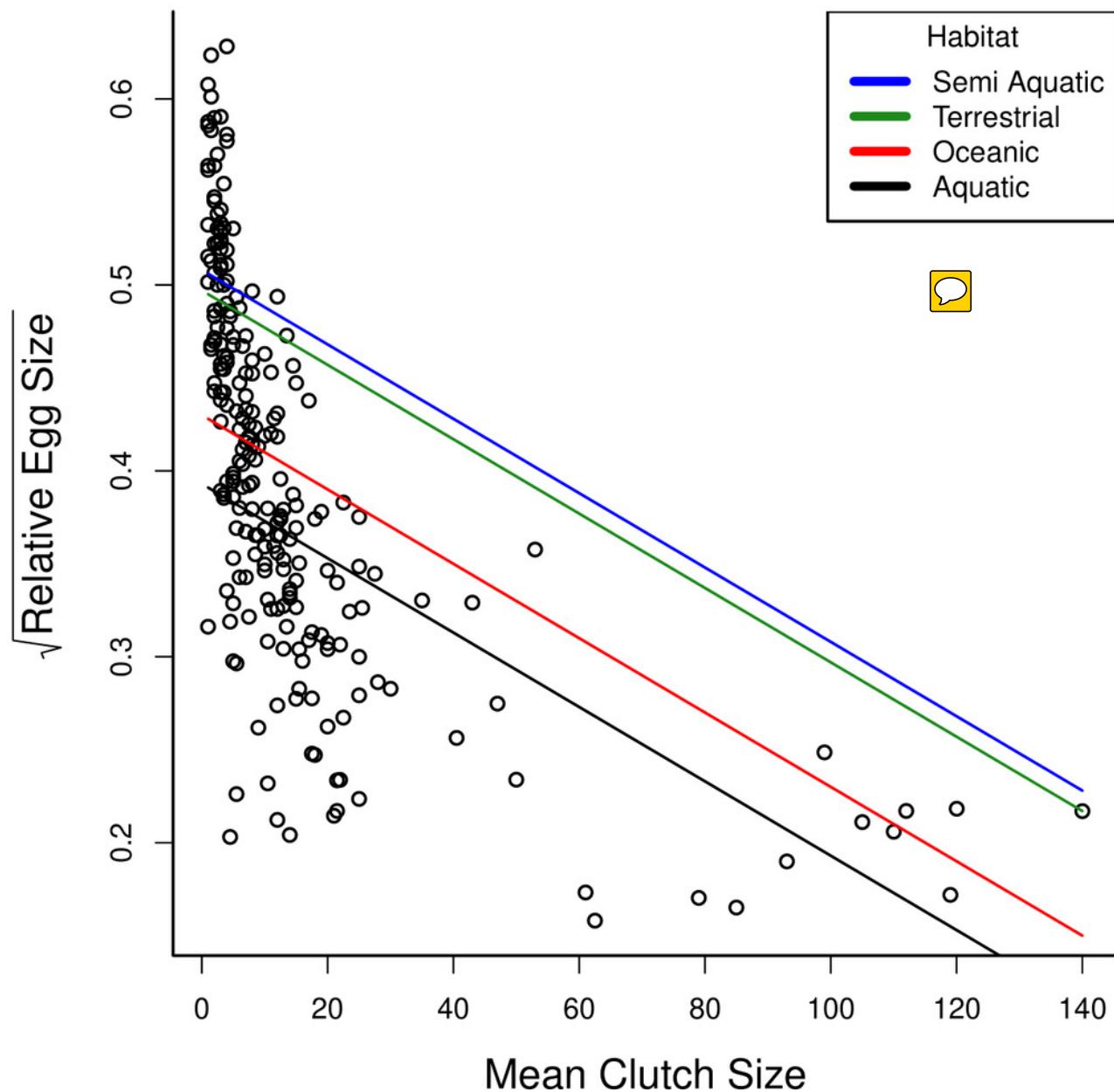
A) Egg size (ESI); B) Fecundity (FEC); and C) Egg shape (ESH)



## Figure 4

Egg size selection's best ranked model

Predicts the relationship of square root relative egg size (egg length/carapace length) to mean clutch size (mean number of eggs laid per clutch) for turtle species that occupy different habitats



# comments

Diogo B. Provete

1/4/2021

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R.Version()\$version.string; R.Version()\$platform	
## [1] "R version 4.0.3 (2020-10-10)"	
## [1] "x86_64-apple-darwin17.0"	
set.seed(1001) <i>#reproducibility</i>	
#Loading packages	
library(GGally)	
packageVersion("GGally")	
## [1] '2.0.0'	
library(phytools)	
packageVersion("phytools")	
## [1] '0.7.70'	
library(nlme)	
packageVersion("nlme")	
## [1] '3.1.151'	
library(tidyverse)	
packageVersion("tidyverse")	
## [1] '1.3.0'	

```
library(readr)
packageVersion("readr")

## [1] '1.4.0'

library(vcd)
packageVersion("vcd")

## [1] '1.4.8'

library(usdm)
packageVersion("usdm")

## [1] '1.1.18'

library(treeplyr)
packageVersion("treeplyr")

## [1] '0.1.10'

library(cowplot)
packageVersion("cowplot")

## [1] '1.1.0'

library(visdat)
packageVersion("visdat")

## [1] '0.5.3'

library(rr2)
packageVersion("rr2")

## [1] '1.0.2'

source("http://ib.berkeley.edu/courses/ib200b/scripts/diagnostics_v3.R")
```

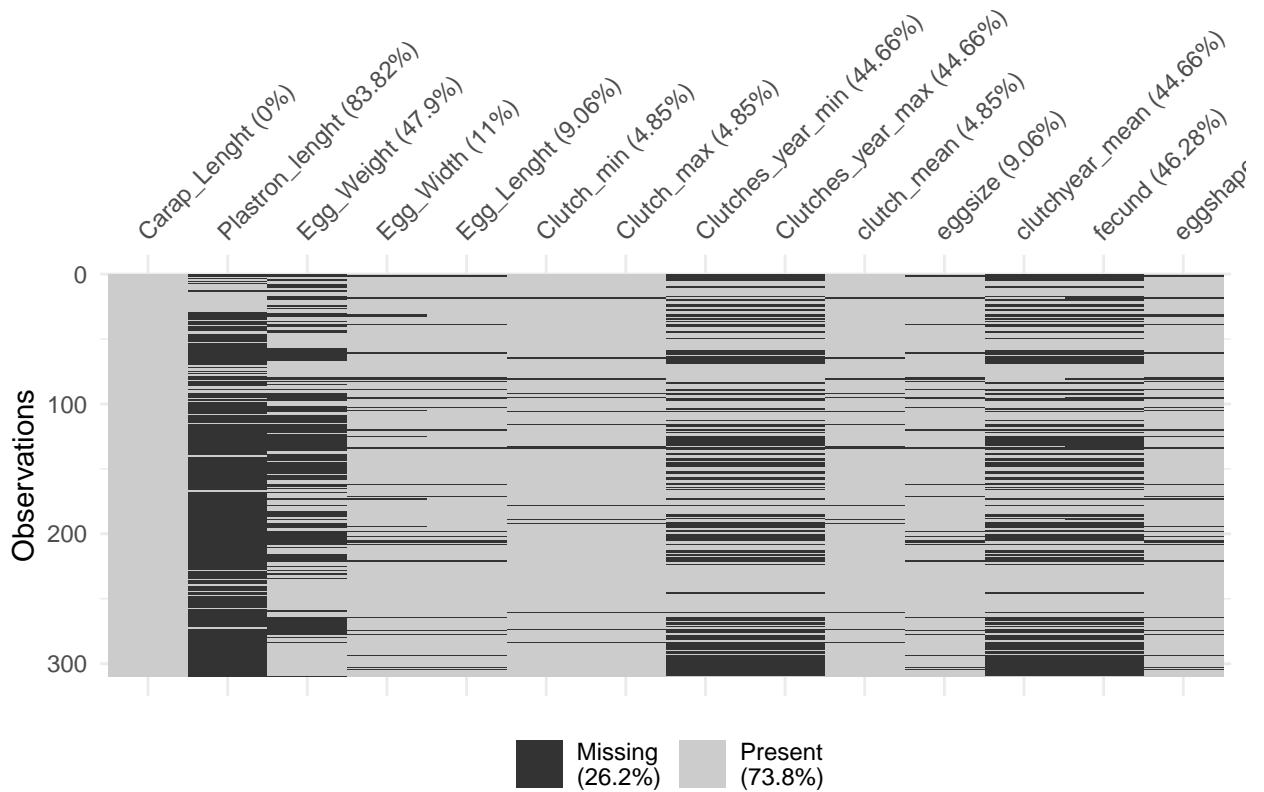
## Data input and handling

```
turtdat<- read_delim("turtdat.txt", "\t", escape_double = FALSE, col_types = cols(Plastron_lenght =
```

```
turtdat <- turtdat %>%
  mutate(clutch_mean = (Clutch_max+Clutch_min)/2,
    eggsize = Egg_Lenght/Carap_Lenght,
    clutchyear_mean = (Clutches_year_max + Clutches_year_min)/2,
    fecund = Clutch_max*clutchyear_mean,
    eggshape = Egg_Lenght/Egg_Width)

vis_miss(turtdat[,-c(1:2)])
```



```
eggsize_dataset <- remove_missing(turtda, vars = c("eggsize", "clutch_mean"))
eggsize_dataset#270 species
```

```
## # A tibble: 270 x 16
##   Species Family Carap_Lenght Plastron_lenght Egg_Weight Egg_Width Egg_Lenght
##   <chr>    <chr>        <dbl>           <dbl>      <dbl>     <dbl>      <dbl>
## 1 Acanth~ Cheli~         175            NA        NA       23       26
## 2 Acanth~ Cheli~         170           165        8.5      25       27
## 3 Acanto~ Cheli~        295            NA        20       28       30
## 4 Chelod~ Cheli~        248           204        NA      22.2     33.8
## 5 Chelod~ Cheli~        275            NA        12       23.5     36.7
## 6 Chelod~ Cheli~        480           260       18.9      25       37
## 7 Chelod~ Cheli~        178            NA        8        20.6     37.1
## 8 Chelod~ Cheli~        232           174        NA       21       30
## 9 Chelod~ Cheli~        160           125        NA       22       32
## 10 Chelod~ Cheli~       217           168        NA       19       28
## # ... with 260 more rows, and 9 more variables: Clutch_min <int>,
## #   Clutch_max <int>, Clutches_year_min <int>, Clutches_year_max <int>,
## #   clutch_mean <dbl>, eggsize <dbl>, clutchyear_mean <dbl>, fecund <dbl>,
## #   eggshape <dbl>
```

```
fecund_dataset <- remove_missing(turtda, vars = "fecund")
fecund_dataset#166 species
```

```
## # A tibble: 166 x 16
##   Species Family Carap_Lenght Plastron_lenght Egg_Weight Egg_Width Egg_Lenght
##   <chr>    <chr>        <dbl>           <dbl>      <dbl>     <dbl>
## 1 Chelod~ Cheli~         275            NA        12       23.5     36.7
## 2 Chelod~ Cheli~         480           260       18.9      25       37
## 3 Chelod~ Cheli~         178            NA        8        20.6     37.1
```

```

##   4 Chelod~ Cheli~      232       174     NA      21      30
##   5 Chelod~ Cheli~      320       245     20      26      35
##   6 Chelod~ Cheli~      180        NA     NA      18      30
##   7 Chelus~ Cheli~      381        NA     NA      35      36
##   8 Elseya~ Cheli~      400       330    37.1    34.4    57.5
##   9 Elseya~ Cheli~      500       364     9.9    29.8    52.6
##  10 Elseya~ Cheli~      285       235     23      30      50
## # ... with 156 more rows, and 9 more variables: Clutch_min <int>,
## #   Clutch_max <int>, Clutches_year_min <int>, Clutches_year_max <int>,
## #   clutch_mean <dbl>, eggsize <dbl>, clutchyear_mean <dbl>, fecund <dbl>,
## #   eggshape <dbl>
dados<- read.csv2("turtles_eggsizes.csv", header=T)
head(dados)

##                               Species   family climatic_zone zoogeography habitat
## 1 Acanthochelys_pallidipectoris Chelidae Tropical Neotropical Aquatic
## 2 Acanthochelys_spixii Chelidae Tropical Neotropical Aquatic
## 3 Acanthochelys_macrocephala Chelidae Tropical Neotropical Aquatic
## 4 Chelodina_cannii Chelidae Tropical Australian Aquatic
## 5 Chelodina_colliei Chelidae Tropical Australian Aquatic
## 6 Chelodina_expansa Chelidae Temperate Australian Aquatic
##   diet carap egglength clutchmin clutchmax
## 1 Carnivore 175      26       2       5
## 2 Carnivore 170      27       1       9
## 3 Carnivore 295      30       1       8
## 4 Carnivore 248     33.8      1      10
## 5 Carnivore 275     36.7      9      16
## 6 Carnivore 480      37       5      30

full_dataset <- inner_join(eggsize_dataset, dados, by = "Species")

full_dataset <- full_dataset %>%
  dplyr::select(Species, Family, Carap_Length, Plastron_Length, Egg_Weight, Egg_Width, Egg_Length,
                Clutch_min, Clutch_max, Clutches_year_min ,
                Clutches_year_max, clutch_mean, eggsize, eggshape,
                clutchyear_mean, fecund, family,
                climatic_zone, zoogeography, habitat, diet)

full_dataset2 <- inner_join(fecund_dataset, dados, by = "Species")

full_dataset2 <- full_dataset2 %>%
  dplyr::select(Species, Family, Carap_Length, Plastron_Length, Egg_Weight, Egg_Width, Egg_Length,
                Clutch_min, Clutch_max, Clutches_year_min ,
                Clutches_year_max, clutch_mean, eggsize, eggshape,
                climatic_zone, zoogeography, habitat, diet)

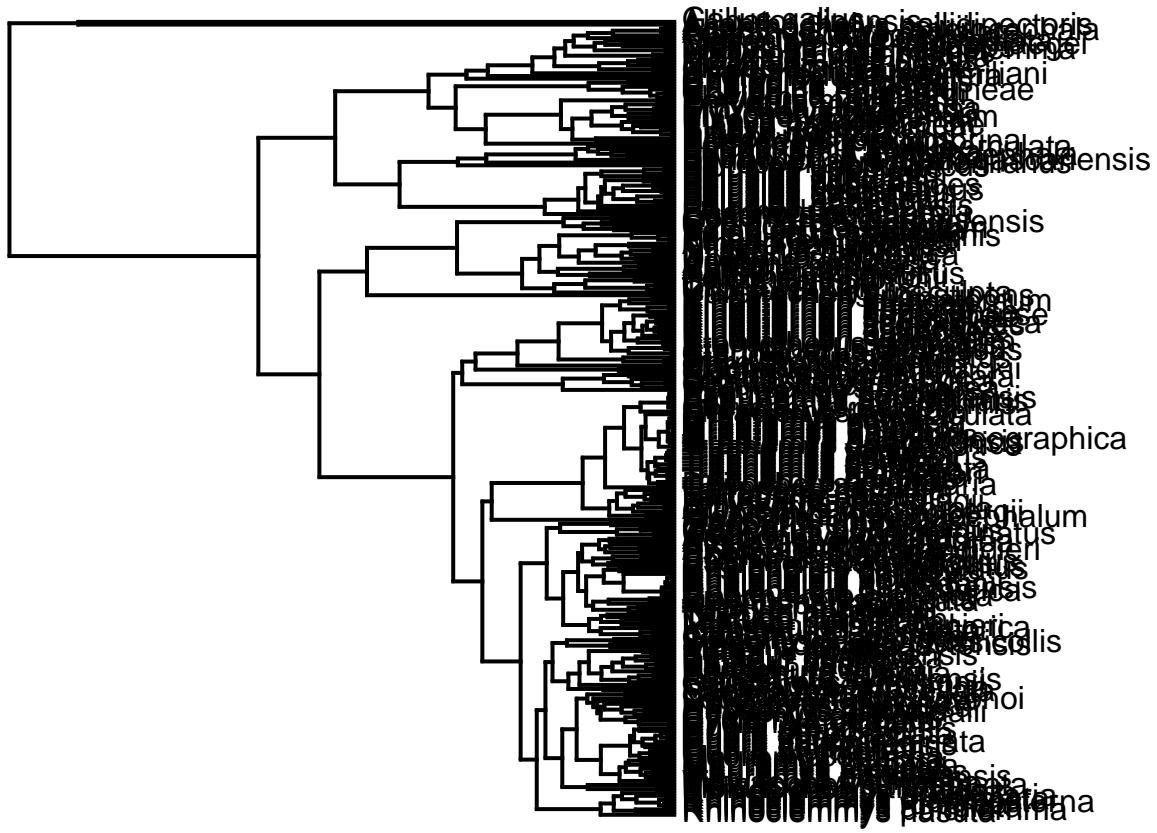
```

## Phylogeny

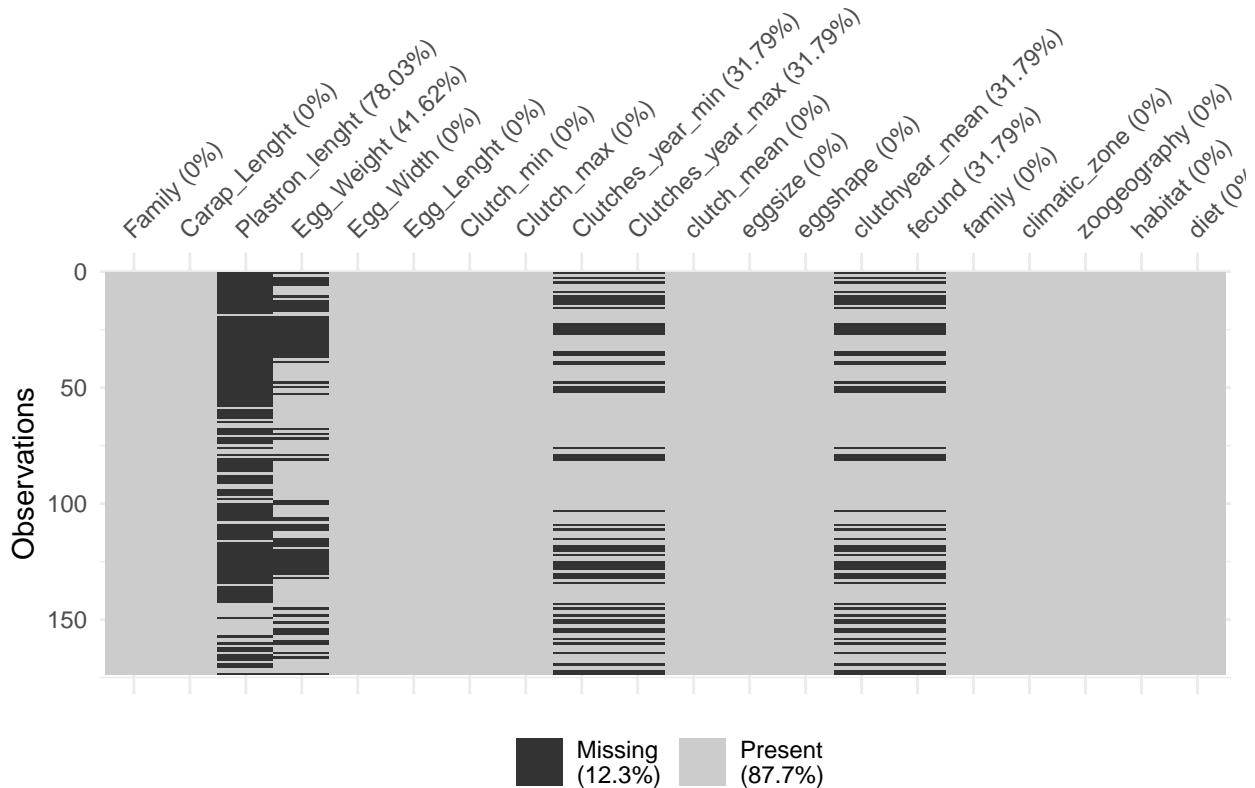
```

phyloPereira <- read.tree('https://ars.els-cdn.com/content/image/1-s2.0-S1055790316304316-mmcc2.nwk')#co
plotTree(phyloPereira)

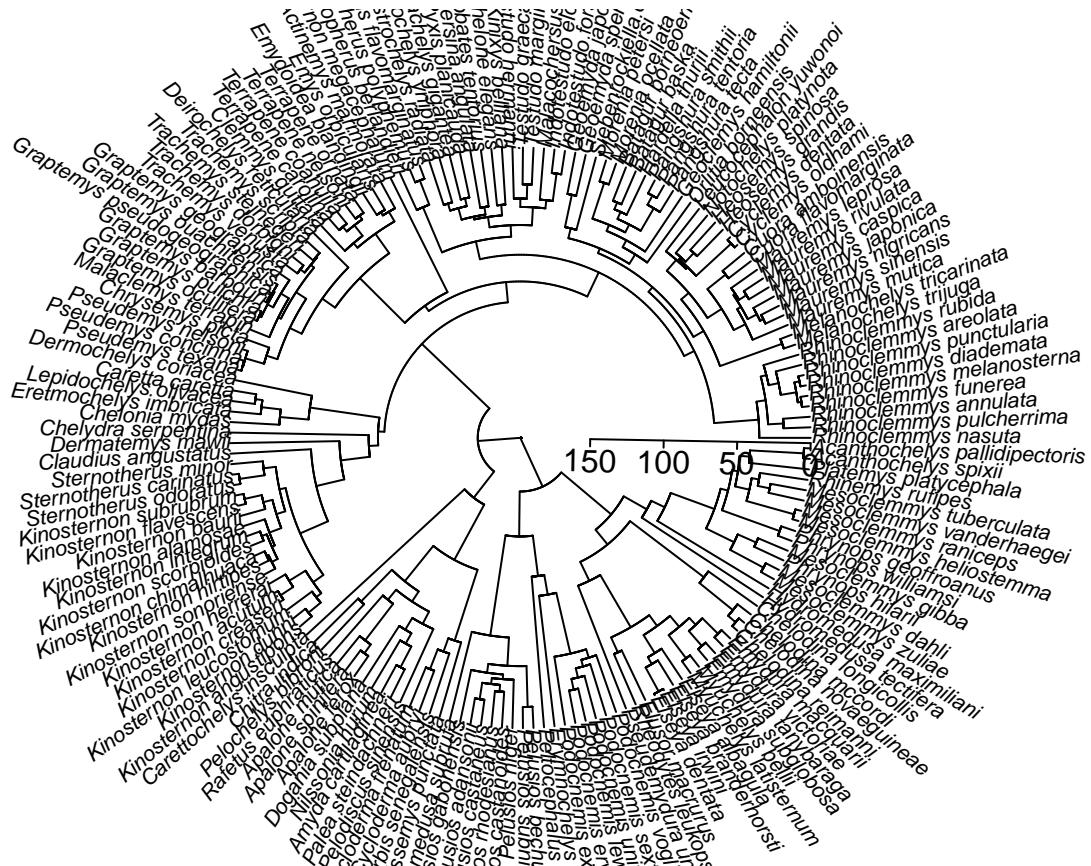
```



```
tidy_data <- make.treedata(phyloPereira, full_dataset) #173 species  
vis_miss(tidy_data$dat)
```



```
plot.phylo(tidy_data$phy, cex = 0.7, type = "fan");axisPhylo()
```



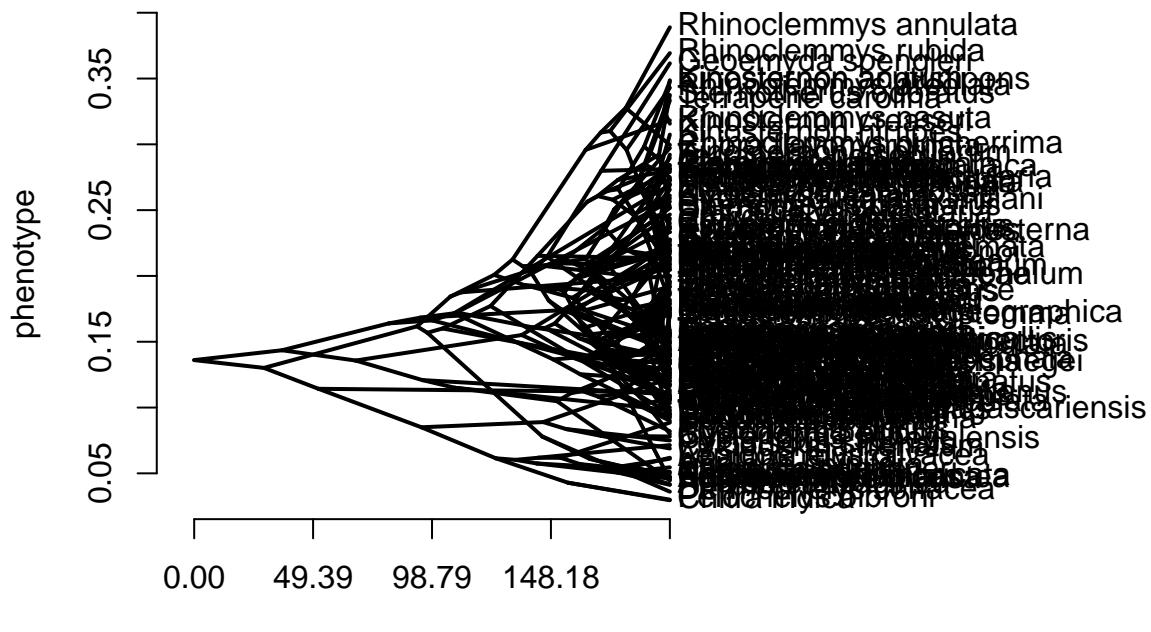
```
tidy_data2 <- make.treedata(phyloPereira, full_dataset2) #118 species
```

## Exploratory data analysis

### Traitgrams/Phenograms

For univariate traits, this is the best tool for visualizing the data. You cannot make a phylomorphospace with such disparate traits. morphospace, as the name says, only applies to morphological traits that are measured as a series of linear or landmark-based measures in a multivariate space.

```
treedply(tidy_data, phytools::phenogram(phy, getVector(tidy_data, eggsizes), spread.labels=FALSE))
```



```
##           x      y
## Rhinoclemmys_nasuta 197.5709 0.31818182
## Rhinoclemmys_pulcherrima 197.5709 0.29951456
## Rhinoclemmys_annulata 197.5709 0.38888889
## Rhinoclemmys_funerea 197.5709 0.20923077
## Rhinoclemmys_melanosterna 197.5709 0.23333333
## Rhinoclemmys_diademata 197.5709 0.22047244
## Rhinoclemmys_punctularia 197.5709 0.27307692
## Rhinoclemmys_areolata 197.5708 0.34299517
## Rhinoclemmys_rubida 197.5709 0.36927374
## Melanochelys_trijuga 197.5709 0.12467532
## Melanochelys_tricarinata 197.5709 0.26993865
## Mauremys_mutica 197.5709 0.21111111
## Mauremys_sinensis 197.5709 0.18181818
## Mauremys_nigricans 197.5709 0.17843866
## Mauremys_japonica 197.5709 0.15311005
## Mauremys_caspica 197.5709 0.14893617
## Mauremys_rivulata 197.5709 0.17500000
## Mauremys_leprosa 197.5709 0.14400000
## Cuora_flavomarginata 197.5709 0.29722222
## Cuora_amboinensis 197.5709 0.27368421
## Cyclemys_oldhami 197.5709 0.23750000
## Cyclemys_dentata 197.5709 0.25909091
## Heosemys_grandis 197.5709 0.14444444
## Heosemys_spinosa 197.5709 0.27272727
## Notochelys_platynota 197.5709 0.15555556
## Leucocephalon_yuwonoi 197.5709 0.21666667
## Orlitia borneensis 197.5709 0.10000000
## Geoclemys_hamiltonii 197.5709 0.14285714
## Pangshura_tecta 197.5709 0.17500000
## Pangshura_tentoria 197.5709 0.15498155
## Pangshura_smithii 197.5709 0.19383260
## Hardella_thurjii 197.5709 0.11320755
```

```

## Batagur_baska           197.5709 0.14074074
## Batagur_borneoensis     197.5709 0.12000000
## Morenia_ocellata        197.5709 0.21818182
## Morenia_petersi         197.5709 0.20454545
## Siebenrockiella_crassicollis 197.5709 0.15000000
## Geoemyda_spengleri     197.5709 0.36153846
## Geoemyda_japonica       197.5709 0.28125000
## Indotestudo_forstenii   197.5708 0.15151515
## Indotestudo_elongata    197.5708 0.17241379
## Malacochersus_tornieri   197.5708 0.26553672
## Testudo_marginata       197.5708 0.09500000
## Testudo_graeca          197.5708 0.15714286
## Testudo_hermannii       197.5708 0.19193548
## Kinixys_belliana        197.5708 0.22325581
## Geochelone_elegans       197.5708 0.21904762
## Psammobates_tentorius   197.5708 0.23622047
## Chersina_angulata        197.5708 0.25161290
## Pyxis_planicauda        197.5708 0.21875000
## Aldabrachelys_gigantea  197.5708 0.04508197
## Astrochelys_yniphora     197.5708 0.11750000
## Astrochelys_radiata      197.5708 0.11627907
## Gopherus_flavomarginatus 197.5708 0.11750000
## Gopherus_polyphemus       197.5708 0.18672199
## Gopherus_berlandieri     197.5709 0.22727273
## Platysternon_megacephalum 197.5709 0.20000000
## Actinemys_marmorata      197.5709 0.20476190
## Emys_orbicularis         197.5709 0.21428571
## Emydoidea_blandingii     197.5709 0.20526316
## Terrapene_ornata          197.5708 0.21232877
## Terrapene_nelsoni         197.5708 0.28965517
## Terrapene_coahuila        197.5708 0.27500000
## Terrapene_carolina        197.5708 0.33333333
## Clemmys_guttata           197.5708 0.28431373
## Deirochelys_reticularia   197.5708 0.24666667
## Trachemys_scripta          197.5709 0.18571429
## Trachemys_stejnegeri      197.5708 0.17916667
## Trachemys_dorbigni         197.5708 0.15653846
## Trachemys_venusta          197.5709 0.09400000
## Graptemys_geographica      197.5709 0.15000000
## Graptemys_ouachitensis     197.5709 0.13333333
## Graptemys_pseudogeographica 197.5709 0.17073171
## Graptemys_barbouri         197.5709 0.13333333
## Graptemys_pulchra          197.5709 0.15555556
## Graptemys_oculifera        197.5709 0.22777778
## Malaclemys_terraepin       197.5709 0.17647059
## Chrysemys_picta            197.5708 0.24000000
## Pseudemys_nelsoni          197.5708 0.12666667
## Pseudemys_concinna         197.5708 0.14000000
## Pseudemys_txana             197.5708 0.10606061
## Dermochelys_coriacea       197.5708 0.03608924
## Caretta_caretta            197.5708 0.04766839
## Lepidochelys.olivacea      197.5708 0.06183206
## Eretmochelys_imbricata      197.5709 0.04712042
## Chelonia_mydas              197.5708 0.04705882

```

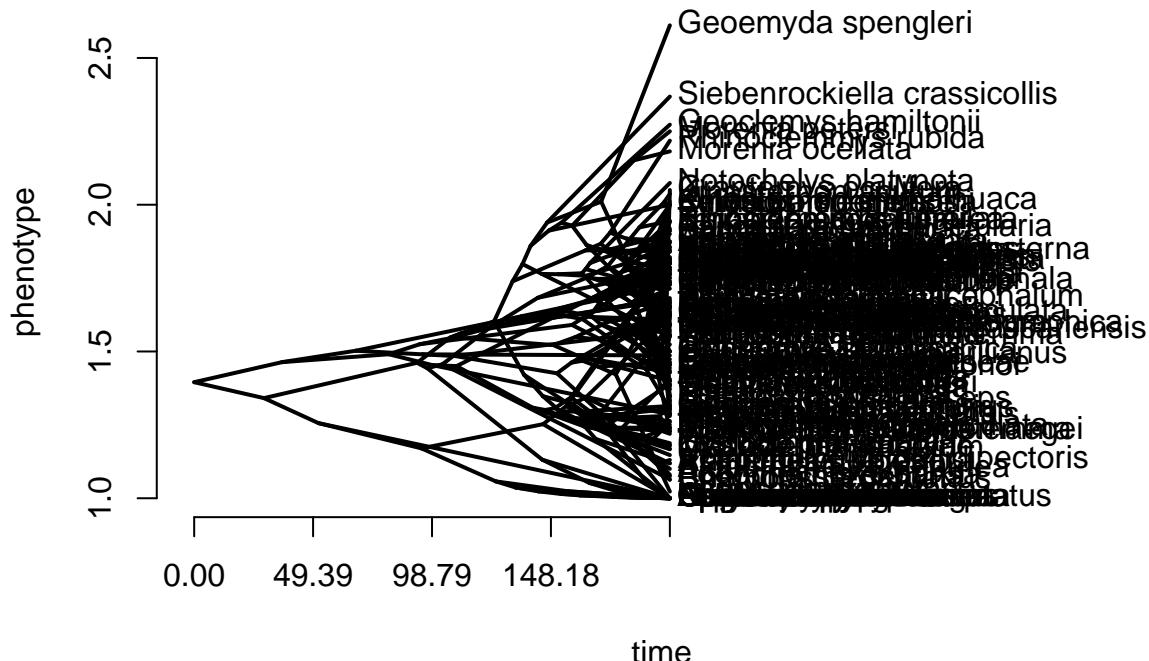
## Chelydra_serpentina	197.5709 0.12790698
## Dermatemys_mawii	197.5709 0.09538462
## Claudius_angustatus	197.5709 0.21333333
## Sternotherus_minor	197.5709 0.28000000
## Sternotherus_carinatus	197.5709 0.25196850
## Sternotherus_odoratus	197.5709 0.33750000
## Kinosternon_subrubrum	197.5709 0.29213483
## Kinosternon_flavescens	197.5709 0.23596491
## Kinosternon_baurii	197.5709 0.27894737
## Kinosternon_alamosae	197.5709 0.26106195
## Kinosternon_integrum	197.5709 0.18061224
## Kinosternon_scorpioides	197.5709 0.23333333
## Kinosternon_chimalhuaca	197.5709 0.28153846
## Kinosternon_hirtipes	197.5709 0.30740741
## Kinosternon_sonoricense	197.5709 0.18750000
## Kinosternon_herrerai	197.5709 0.21875000
## Kinosternon_acutum	197.5709 0.34864865
## Kinosternon_creaseri	197.5709 0.31570248
## Kinosternon_leucostomum	197.5709 0.20673077
## Kinosternon_dunni	197.5709 0.28125000
## Kinosternon_angustipons	197.5709 0.34782609
## Carettochelys_insculpta	197.5709 0.11168831
## Chitra_indica	197.5708 0.02956522
## Pelochelys_bibroni	197.5708 0.03000000
## Rafetus_euphraticus	197.5708 0.04600000
## Apalone_mutica	197.5708 0.06111111
## Apalone_spinifera	197.5708 0.05454545
## Apalone_ferox	197.5708 0.04166667
## Dogania_subplana	197.5708 0.08857143
## Nilssonia_hurum	197.5708 0.05000000
## Amyda_cartilaginea	197.5708 0.04125000
## Palea_steindachneri	197.5708 0.05116279
## Pelodiscus_sinensis	197.5709 0.07142857
## Cycloderma_frenatum	197.5709 0.06889764
## Cycloderma_aubryi	197.5709 0.07800000
## Cyclanorbis_senegalensis	197.5709 0.07500000
## Lissemys_punctata	197.5709 0.12227074
## Pelomedusa_subrufa	197.5709 0.22352941
## Pelusios_gabonensis	197.5708 0.10606061
## Pelusios_adansonii	197.5709 0.13636364
## Pelusios_castaneus	197.5709 0.12280702
## Pelusios_rhodesianus	197.5709 0.14000000
## Pelusios_castanoides	197.5709 0.14545455
## Pelusios_niger	197.5709 0.17142857
## Pelusios_subniger	197.5708 0.12413793
## Pelusios_bechuanicus	197.5708 0.10909091
## Peltoccephalus_dumerilianus	197.5709 0.11000000
## Erymnochelys_madagascariensis	197.5709 0.09812500
## Podocnemis_expansa	197.5709 0.04458000
## Podocnemis erythrocephala	197.5709 0.13593750
## Podocnemis_lewyana	197.5709 0.09000000
## Podocnemis_unifilis	197.5709 0.08200000
## Podocnemis_sextuberculata	197.5709 0.14666667
## Podocnemis_vogli	197.5709 0.14117647

```

## Pseudemydura_umbrina      197.5709 0.26923077
## Rheodytes_leukops         197.5709 0.12048193
## Elusor_macrurus          197.5709 0.09259259
## Elseya_dentata            197.5708 0.17543860
## Elseya_irwini             197.5708 0.13846154
## Elseya_branderhorsti     197.5709 0.10520000
## Elseya_albagula           197.5708 0.14375000
## Myuchelys_latisternum     197.5708 0.10714286
## Myuchelys_bellii          197.5708 0.08000000
## Emydura_subglobosa        197.5709 0.15384615
## Emydura_tanybaraga        197.5709 0.19161677
## Emydura_victoriae         197.5709 0.24375000
## Emydura_macquarrii        197.5709 0.10645161
## Chelodina_reimanni        197.5708 0.12903226
## Chelodina_novaeguineae    197.5708 0.20000000
## Chelodina_mccordi         197.5709 0.12931034
## Chelodina_longicollis     197.5709 0.20842697
## Hydromedusa_tectifera     197.5708 0.12000000
## Hydromedusa_maximiliani   197.5709 0.25649718
## Mesoclemmys_zuliae        197.5709 0.12607143
## Mesoclemmys_dahli         197.5709 0.19565217
## Phrynops_hilarii          197.5709 0.09250000
## Mesoclemmys_gibba         197.5709 0.19565217
## Phrynops_williamsi        197.5708 0.13492063
## Phrynops_geoffroanus       197.5708 0.09714286
## Mesoclemmys_heliostemma    197.5708 0.16933333
## Mesoclemmys_raniceps       197.5708 0.10810811
## Mesoclemmys_vanderhaegei   197.5708 0.13358779
## Mesoclemmys_tuberculata    197.5708 0.10333333
## Rhinemys_rufipes          197.5708 0.17407407
## Platemys_platycephala     197.5709 0.28333333
## Acanthochelys_spixii        197.5708 0.15882353
## Acanthochelys_pallidipectoris 197.5708 0.14857143

treedply(tidy_data, phytools::phenogram(phy, getVector(tidy_data, eggshape), spread.labels=FALSE, quiet)

```



```

##          x      y
## Rhinoclemmys_nasuta 197.5709 1.842105
## Rhinoclemmys_pulcherrima 197.5709 1.550251
## Rhinoclemmys_annulata 197.5709 1.944444
## Rhinoclemmys_funerea 197.5709 1.942857
## Rhinoclemmys_melanosterna 197.5709 1.842105
## Rhinoclemmys_diademata 197.5709 1.806452
## Rhinoclemmys_punctularia 197.5709 1.918919
## Rhinoclemmys_areolata 197.5708 1.839378
## Rhinoclemmys_rubida 197.5709 2.218121
## Melanochelys_trijuga 197.5709 1.371429
## Melanochelys_tricarinata 197.5709 1.760000
## Mauremys_mutica 197.5709 1.809524
## Mauremys_sinensis 197.5709 1.600000
## Mauremys_nigricans 197.5709 1.846154
## Mauremys_japonica 197.5709 1.454545
## Mauremys_caspica 197.5709 1.750000
## Mauremys_rivulata 197.5709 1.590909
## Mauremys_leprosa 197.5709 1.800000
## Cuora_flavomarginata 197.5709 1.910714
## Cuora_amboinensis 197.5709 1.733333
## Cyclemys_oldhami 197.5709 1.781250
## Cyclemys_dentata 197.5709 1.628571
## Heosemys_grandis 197.5709 1.857143
## Heosemys_spinosa 197.5709 1.875000
## Notochelys_platynota 197.5709 2.074074
## Leucocephalon_yuwonoi 197.5709 1.444444
## Orlitia_borneensis 197.5709 2.000000
## Geoclemmys_hamiltonii 197.5709 2.272727
## Pangshura_tecta 197.5709 1.555556
## Pangshura_tentoria 197.5709 1.555556
## Pangshura_smithii 197.5709 1.913043
## Hardella_thurjii 197.5709 1.764706

```

```

## Batagur_baska           197.5709 1.900000
## Batagur_borneoensis     197.5709 1.800000
## Morenia_ocellata        197.5709 2.181818
## Morenia_petersi         197.5709 2.250000
## Siebenrockiella_crassicollis 197.5709 2.368421
## Geoemyda_spengleri      197.5709 2.611111
## Geoemyda_japonica        197.5709 1.500000
## Indotestudo_forstenii    197.5708 1.219512
## Indotestudo_elongata      197.5708 1.250000
## Malacochersus_tornieri    197.5708 1.620690
## Testudo_marginata         197.5708 1.187500
## Testudo_graeca            197.5708 1.178571
## Testudo_hermannii          197.5708 1.239583
## Kinixys_belliana           197.5708 1.263158
## Geochelone_elegans          197.5708 1.314286
## Psammobates_tentorius      197.5708 1.304348
## Chersina_angulata           197.5708 1.147059
## Pyxis_planicauda            197.5708 1.590909
## Aldabrachelys_gigantea      197.5708 1.100000
## Astrochelys_yniphora        197.5708 1.119048
## Astrochelys_radiata          197.5708 1.000000
## Gopherus_flavomarginatus     197.5708 1.000000
## Gopherus_polyphemus           197.5708 1.000000
## Gopherus_berlandieri         197.5709 1.388889
## Platysternon_megacephalum     197.5709 1.681818
## Actinemys_marmorata          197.5709 1.869565
## Emys_orbicularis             197.5709 1.764706
## Emydoidea_blandingii          197.5709 1.625000
## Terrapene_ornata              197.5708 1.347826
## Terrapene_nelsoni             197.5708 1.555556
## Terrapene_coahuila            197.5708 1.941176
## Terrapene_carolina             197.5708 1.727273
## Clemmys_guttata                197.5708 1.812500
## Deirochelys_reticularia        197.5708 1.608696
## Trachemys_scripta              197.5709 1.500000
## Trachemys_stejnegeri           197.5708 1.653846
## Trachemys_dorbigni             197.5708 1.565385
## Trachemys_venusta              197.5709 1.382353
## Graptemys_geographica           197.5709 1.500000
## Graptemys_ouachitensis          197.5709 1.280000
## Graptemys_pseudogeographica      197.5709 1.590909
## Graptemys_barbouri              197.5709 1.384615
## Graptemys_pulchra                197.5709 1.312500
## Graptemys_oculifera              197.5709 2.050000
## Malaclemys_terraepin            197.5709 1.615385
## Chrysemys_picta                  197.5708 1.875000
## Pseudemys_nelsoni                 197.5708 1.461538
## Pseudemys_concinna                197.5708 1.555556
## Pseudemys_txana                   197.5708 1.346154
## Dermochelys_coriacea              197.5708 1.000000
## Caretta_caretta                  197.5708 1.000000
## Lepidochelys.olivacea            197.5708 1.000000
## Eretmochelys_imbricata             197.5709 1.000000
## Chelonia_mydas                   197.5708 1.000000

```

```

## Chelydra_serpentina      197.5709 1.064516
## Dermatemys_mawii        197.5709 1.675676
## Claudius_angustatus    197.5709 1.777778
## Sternotherus_minor      197.5709 1.647059
## Sternotherus_carinatus 197.5709 1.777778
## Sternotherus_odoratus   197.5709 1.800000
## Kinosternon_subrubrum   197.5709 1.733333
## Kinosternon_flavescens  197.5709 1.620482
## Kinosternon_baurii      197.5709 1.647668
## Kinosternon_alamosae     197.5709 1.787879
## Kinosternon_integrum    197.5709 1.853403
## Kinosternon_scorpioides 197.5709 1.842105
## Kinosternon_chimalhuaca 197.5709 2.010989
## Kinosternon_hirtipes    197.5709 1.784946
## Kinosternon_sonoricense 197.5709 1.736842
## Kinosternon_herrerai    197.5709 1.944444
## Kinosternon_acutum       197.5709 2.036842
## Kinosternon_creaseri    197.5709 2.000000
## Kinosternon_leucostomum 197.5709 1.592593
## Kinosternon_dunni        197.5709 1.800000
## Kinosternon_angustipons 197.5709 1.818182
## Carettochelys_insculpta 197.5709 1.000000
## Chitra_indica           197.5708 1.000000
## Pelochelys_bibroni      197.5708 1.000000
## Rafetus_euphraticus    197.5708 1.000000
## Apalone_mutica          197.5708 1.000000
## Apalone_spinifera       197.5708 1.000000
## Apalone_ferox           197.5708 1.000000
## Dogania_subplana        197.5708 1.000000
## Nilssonia_hurum         197.5708 1.000000
## Amyda_cartilaginea      197.5708 1.000000
## Palea_steindachneri    197.5708 1.000000
## Pelodiscus_sinensis    197.5709 1.000000
## Cycloderma_frenatum    197.5709 1.166667
## Cycloderma_aubryi       197.5709 1.181818
## Cyclanorbis_senegalensis 197.5709 1.800000
## Lissemys_punctata       197.5709 1.000000
## Pelomedusa_subrufa     197.5709 1.727273
## Pelusios_gabonensis     197.5708 1.400000
## Pelusios_adansonii      197.5709 1.666667
## Pelusios_castaneus      197.5709 1.400000
## Pelusios_rhodesianus    197.5709 1.590909
## Pelusios_castanoides    197.5709 1.454545
## Pelusios_niger          197.5709 2.000000
## Pelusios_subniger       197.5708 1.714286
## Pelusios_bechuanicus   197.5708 1.636364
## Peltcephalus_dumerilianus 197.5709 1.486486
## Erymnochelys_madagascariensis 197.5709 1.572621
## Podocnemis_expansa      197.5709 1.074735
## Podocnemis erythrocephala 197.5709 1.740000
## Podocnemis_lewyana      197.5709 1.022727
## Podocnemis_unifilis      197.5709 1.464286
## Podocnemis_sextuberculata 197.5709 1.629630
## Podocnemis_vogli         197.5709 1.655172

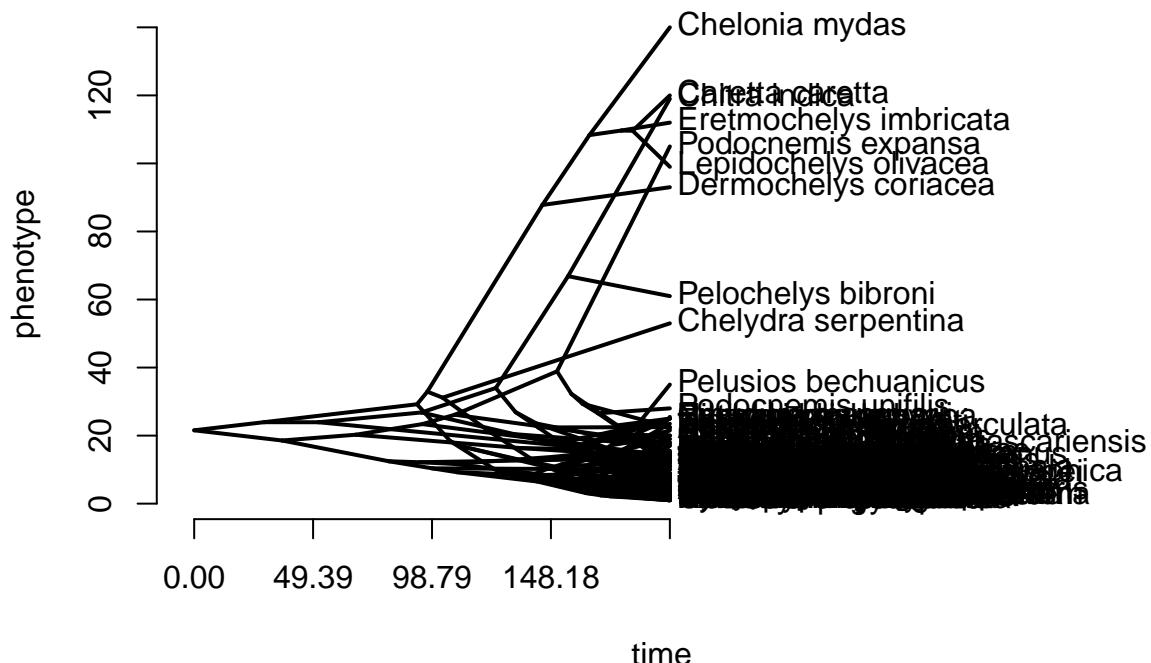
```

```

## Pseudemydura_umbrina      197.5709 1.750000
## Rheodytes_leukops         197.5709 1.428571
## Elusor_macrurus          197.5709 1.400000
## Elseya_dentata            197.5708 1.666667
## Elseya_irwini             197.5708 1.285714
## Elseya_branderhorsti     197.5709 1.765101
## Elseya_albagula           197.5708 1.671512
## Myuchelys_latisternum     197.5708 1.304348
## Myuchelys_bellii          197.5708 1.523810
## Emydura_subglobosa        197.5709 2.000000
## Emydura_tanybaraga        197.5709 1.230769
## Emydura_victoriae         197.5709 1.772727
## Emydura_macquarrii        197.5709 1.434783
## Chelodina_reimanni        197.5708 1.473684
## Chelodina_novaeguineae    197.5708 1.454545
## Chelodina_mccordi         197.5709 1.428571
## Chelodina_longicollis     197.5709 1.800971
## Hydromedusa_tectifera     197.5708 1.285714
## Hydromedusa_maximiliani   197.5709 1.816000
## Mesoclemmys_zuliae        197.5709 1.168874
## Mesoclemmys_dahli         197.5709 1.241379
## Phrynops_hilarii          197.5709 1.000000
## Mesoclemmys_gibba         197.5709 1.406250
## Phrynops_williamsi        197.5708 1.259259
## Phrynops_geoffroanus       197.5708 1.062500
## Mesoclemmys_heliostemma    197.5708 1.227053
## Mesoclemmys_raniceps       197.5708 1.333333
## Mesoclemmys_vanderhaegei   197.5708 1.228070
## Mesoclemmys_tuberculata    197.5708 1.240000
## Rhinemys_rufipes          197.5708 1.119048
## Platemys_platycephala     197.5709 1.821429
## Acanthochelys_spixii        197.5708 1.080000
## Acanthochelys_pallidipectoris 197.5708 1.130435

treedply(tidy_data, phytools::phenogram(phy, getVector(tidy_data, clutch_mean), spread.labels=FALSE, qu

```



```

##                                     x     y
## Rhinoclemmys_nasuta           197.5709 1.0
## Rhinoclemmys_pulcherrima     197.5709 2.0
## Rhinoclemmys_annulata        197.5709 1.5
## Rhinoclemmys_funerea         197.5709 3.0
## Rhinoclemmys_melanosterna    197.5709 2.0
## Rhinoclemmys_diademata      197.5709 2.0
## Rhinoclemmys_punctularia     197.5709 2.5
## Rhinoclemmys_areolata        197.5708 1.0
## Rhinoclemmys_rubida          197.5709 1.0
## Melanochelys_trijuga        197.5709 5.0
## Melanochelys_tricarinata    197.5709 3.0
## Mauremys_mutica             197.5709 8.0
## Mauremys_sinensis           197.5709 3.0
## Mauremys_nigricans          197.5709 4.0
## Mauremys_japonica           197.5709 6.5
## Mauremys_caspica            197.5709 5.0
## Mauremys_rivulata           197.5709 12.0
## Mauremys_leprosa             197.5709 8.0
## Cuora_flavomarginata       197.5709 2.0
## Cuora_amboinensis          197.5709 3.0
## Cyclemys_oldhami            197.5709 3.0
## Cyclemys_dentata             197.5709 3.0
## Heosemys_grandis            197.5709 6.0
## Heosemys_spinosa             197.5709 2.0
## Notochelys_platynota        197.5709 4.0
## Leucocephalon_yuwonoi       197.5709 1.5
## Orlitia_borneensis           197.5709 13.5
## Geoclemys_hamiltonii        197.5709 19.0
## Pangshura_tecta              197.5709 7.5
## Pangshura_tentoria           197.5709 8.0
## Pangshura_smithii            197.5709 7.0
## Hardella_thurjii             197.5709 14.0

```

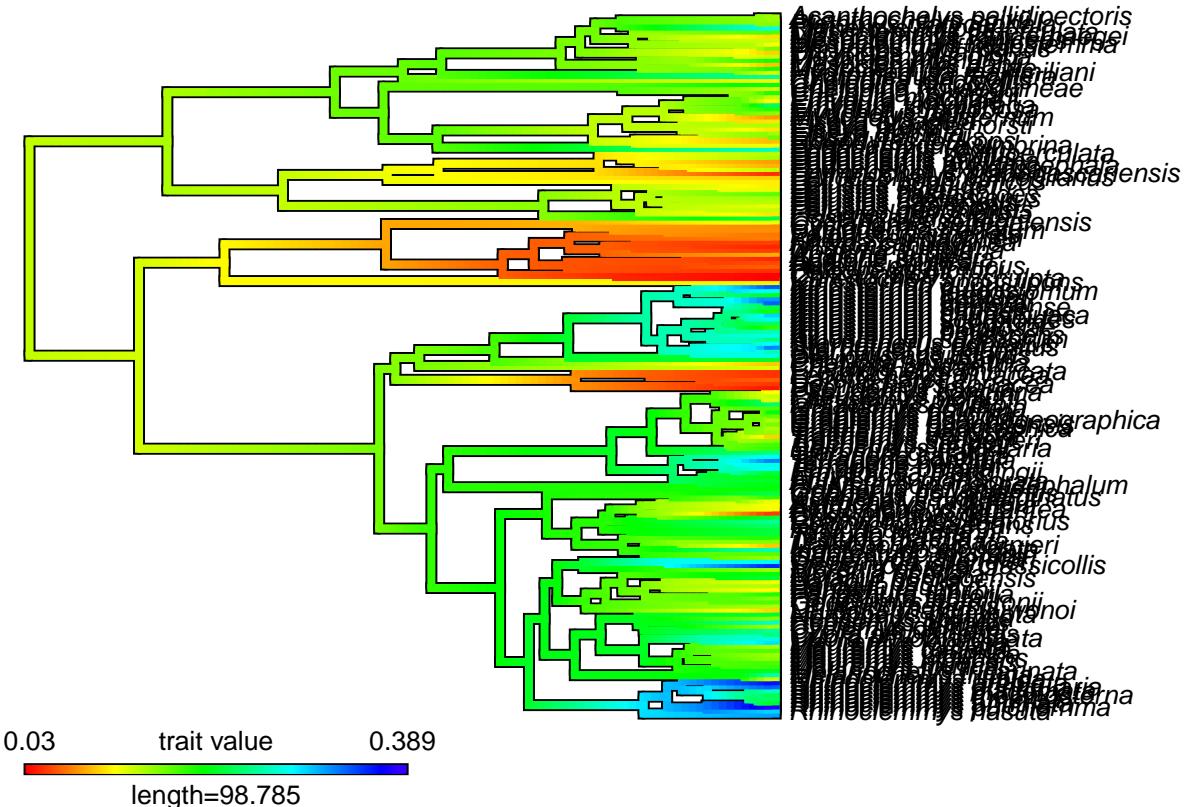
## Batagur_baska	197.5709	25.0
## Batagur_borneoensis	197.5709	20.0
## Morenia_ocellata	197.5709	6.5
## Morenia_petersi	197.5709	8.0
## Siebenrockiella_crassicollis	197.5709	3.5
## Geoemyda_spengleri	197.5709	1.5
## Geoemyda_japonica	197.5709	5.0
## Indotestudo_forstenii	197.5708	3.0
## Indotestudo_elongata	197.5708	7.0
## Malacochersus_tornieri	197.5708	1.0
## Testudo_marginata	197.5708	10.5
## Testudo_graeca	197.5708	5.0
## Testudo_hermannii	197.5708	3.0
## Kinixys_belliana	197.5708	7.0
## Geochelone_elegans	197.5708	3.0
## Psammobates_tentorius	197.5708	2.0
## Chersina_angulata	197.5708	1.0
## Pyxis_planicauda	197.5708	1.5
## Aldabrachelys_gigantea	197.5708	12.0
## Astrochelys_yniphora	197.5708	6.0
## Astrochelys_radiata	197.5708	15.0
## Gopherus_flavomarginatus	197.5708	7.0
## Gopherus_polyphemus	197.5708	5.5
## Gopherus_berlandieri	197.5709	4.0
## Platysternon_megacephalum	197.5709	2.0
## Actinemys_marmorata	197.5709	7.0
## Emys_orbicularis	197.5709	10.0
## Emydoidea_blandingii	197.5709	11.0
## Terrapene_ornata	197.5708	4.0
## Terrapene_nelsoni	197.5708	2.5
## Terrapene_coahuila	197.5708	3.0
## Terrapene_carolina	197.5708	4.0
## Clemmys_guttata	197.5708	3.0
## Deirochelys_reticularia	197.5708	8.0
## Trachemys_scripta	197.5709	12.0
## Trachemys_stejnegeri	197.5708	8.5
## Trachemys_dorbigni	197.5708	12.5
## Trachemys_venusta	197.5709	22.0
## Graptemys_geographica	197.5709	14.5
## Graptemys_ouachitensis	197.5709	12.0
## Graptemys_pseudogeographica	197.5709	9.0
## Graptemys_barbouri	197.5709	9.0
## Graptemys_pulchra	197.5709	5.0
## Graptemys_oculifera	197.5709	2.5
## Malaclemys_terrapping	197.5709	11.0
## Chrysemys_picta	197.5708	4.0
## Pseudemys_nelsoni	197.5708	12.0
## Pseudemys_concinnna	197.5708	18.0
## Pseudemys_texana	197.5708	11.0
## Dermochelys_coriacea	197.5708	93.0
## Caretta_caretta	197.5708	120.0
## Lepidochelys.olivacea	197.5708	99.0
## Eretmochelys_imbricata	197.5709	112.0
## Chelonia_mydas	197.5708	140.0

## Chelydra_serpentina	197.5709	53.0
## Dermatemys_mawii	197.5709	17.0
## Claudius_angustatus	197.5709	3.5
## Sternotherus_minor	197.5709	3.0
## Sternotherus_carinatus	197.5709	4.0
## Sternotherus_odoratus	197.5709	4.0
## Kinosternon_subrubrum	197.5709	3.0
## Kinosternon_flavescens	197.5709	4.5
## Kinosternon_baurii	197.5709	3.0
## Kinosternon_alamosae	197.5709	4.0
## Kinosternon_integrum	197.5709	7.5
## Kinosternon_scorpioides	197.5709	4.5
## Kinosternon_chimalhuaca	197.5709	3.5
## Kinosternon_hirtipes	197.5709	3.5
## Kinosternon_sonoricense	197.5709	7.0
## Kinosternon_herrerai	197.5709	5.0
## Kinosternon_acutum	197.5709	3.0
## Kinosternon_creaseri	197.5709	1.0
## Kinosternon_leucostomum	197.5709	3.5
## Kinosternon_dunni	197.5709	2.5
## Kinosternon_angustipons	197.5709	2.0
## Carettochelys_insculpta	197.5709	14.0
## Chitra_indica	197.5708	119.0
## Pelochelys_bibroni	197.5708	61.0
## Rafetus_euphraticus	197.5708	10.0
## Apalone_mutica	197.5708	18.0
## Apalone_spinifera	197.5708	21.5
## Apalone_ferox	197.5708	14.0
## Dogania_subplana	197.5708	5.0
## Nilssonia_hurum	197.5708	25.0
## Amyda_cartilaginea	197.5708	4.5
## Palea_steindachneri	197.5708	5.5
## Pelodiscus_sinensis	197.5709	22.5
## Cycloderma_frenatum	197.5709	20.0
## Cycloderma_aubryi	197.5709	25.0
## Cyclanorbis_senegalensis	197.5709	12.0
## Lissemys_punctata	197.5709	10.0
## Pelomedusa_subrufa	197.5709	13.5
## Pelusios_gabonensis	197.5708	12.0
## Pelusios_adansonii	197.5709	15.0
## Pelusios_castaneus	197.5709	15.5
## Pelusios_rhodesianus	197.5709	12.5
## Pelusios_castanoides	197.5709	15.0
## Pelusios_niger	197.5709	8.0
## Pelusios_subniger	197.5708	13.0
## Pelusios_bechuanicus	197.5708	35.0
## Peltoccephalus_dumerilianus	197.5709	14.0
## Erymnochelys_madagascariensis	197.5709	17.5
## Podocnemis_expansa	197.5709	105.0
## Podocnemis erythrocephala	197.5709	10.0
## Podocnemis_lewyana	197.5709	25.0
## Podocnemis_unifilis	197.5709	28.0
## Podocnemis_sextuberculata	197.5709	22.5
## Podocnemis_vogli	197.5709	12.5

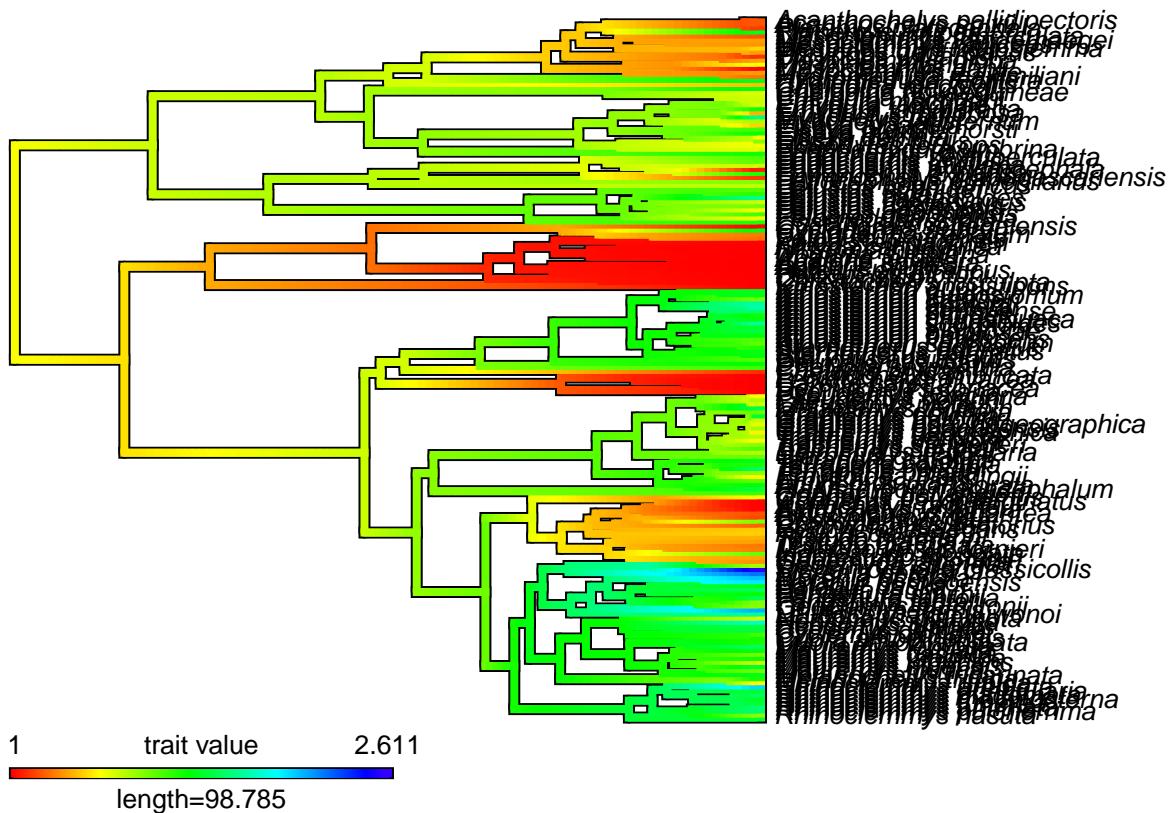
```

## Pseudemydura_umbrina      197.5709  4.0
## Rheodytes_leukops         197.5709 13.0
## Elusor_macrurus          197.5709 13.0
## Elseya_dentata            197.5708 10.0
## Elseya_irwini             197.5708 12.0
## Elseya_branderhorsti     197.5709 23.5
## Elseya_albagula           197.5708 13.0
## Myuchelys_latisternum     197.5708 13.0
## Myuchelys_bellii          197.5708 15.5
## Emydura_subglobosa        197.5709  7.5
## Emydura_tanybaraga        197.5709 17.0
## Emydura_victoriae         197.5709 12.0
## Emydura_macquarrii        197.5709 25.5
## Chelodina_reimanni        197.5708 10.0
## Chelodina_novaeguineae    197.5708 15.0
## Chelodina_mccordi         197.5709 11.5
## Chelodina_longicollis     197.5709 14.5
## Hydromedusa_tectifera     197.5708 10.0
## Hydromedusa_maximiliani   197.5709  2.0
## Mesoclemmys_zuliae        197.5709  8.5
## Mesoclemmys_dahli         197.5709  3.5
## Phrynops_hilarii          197.5709 20.0
## Mesoclemmys_gibba         197.5709  3.0
## Phrynops_williamsi        197.5708  7.0
## Phrynops_geoffroanus       197.5708 19.0
## Mesoclemmys_heliostemma    197.5708  6.5
## Mesoclemmys_raniceps       197.5708  5.0
## Mesoclemmys_vanderhaegei   197.5708  8.5
## Mesoclemmys_tuberculata    197.5708  7.5
## Rhinemys_rufipes          197.5708  7.5
## Platemys_platycephala     197.5709  1.0
## Acanthochelys_spixii        197.5708  9.0
## Acanthochelys_pallidipectoris 197.5708  3.5
treedply(tidy_data, phytools:::contMap(phy, getVector(tidy_data, eggsize), fsize=0.8))

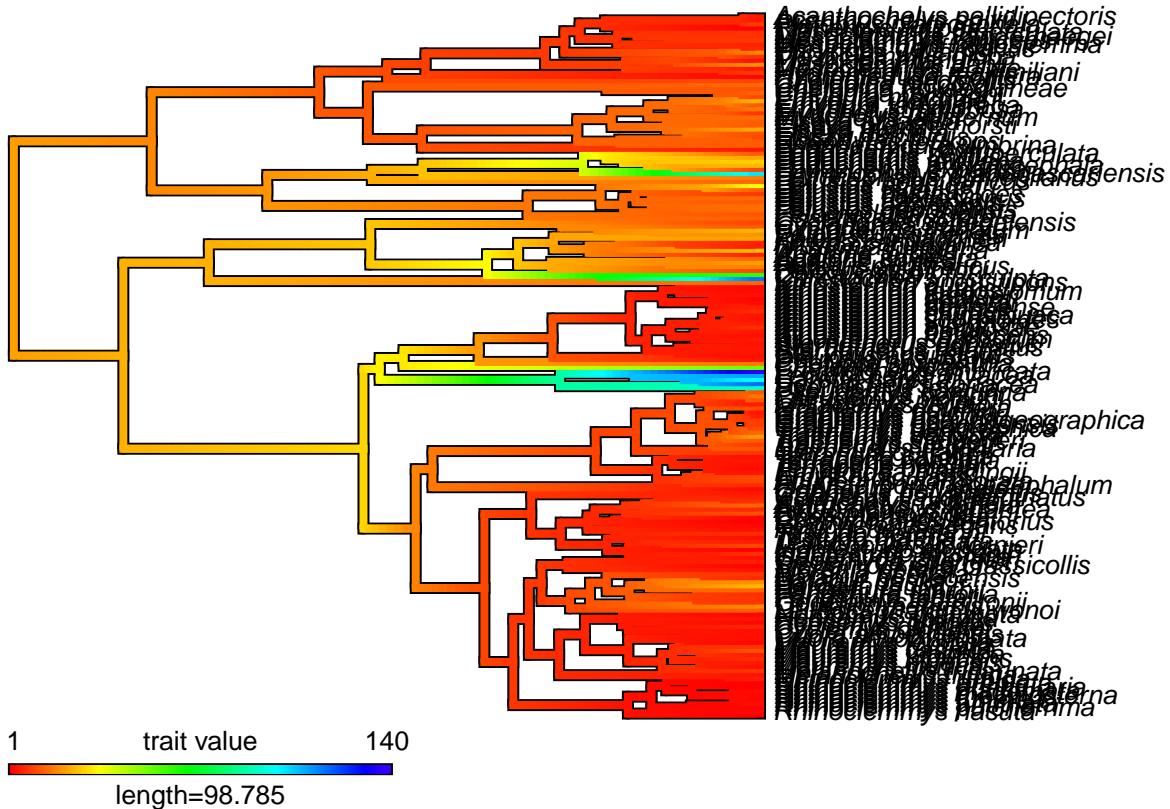
```



```
## Object of class "contMap" containing:  
##  
## (1) A phylogenetic tree with 173 tips and 172 internal nodes.  
##  
## (2) A mapped continuous trait on the range (0.029565, 0.388889).  
treedply(tidy_data, phytools::contMap(phy, getVector(tidy_data, eggshape), fsize=0.8))
```



```
## Object of class "contMap" containing:  
##  
## (1) A phylogenetic tree with 173 tips and 172 internal nodes.  
##  
## (2) A mapped continuous trait on the range (1, 2.611111).  
treedply(tidy_data, phytools::contMap(phy, getVector(tidy_data, clutch_mean), fsize=0.8))
```

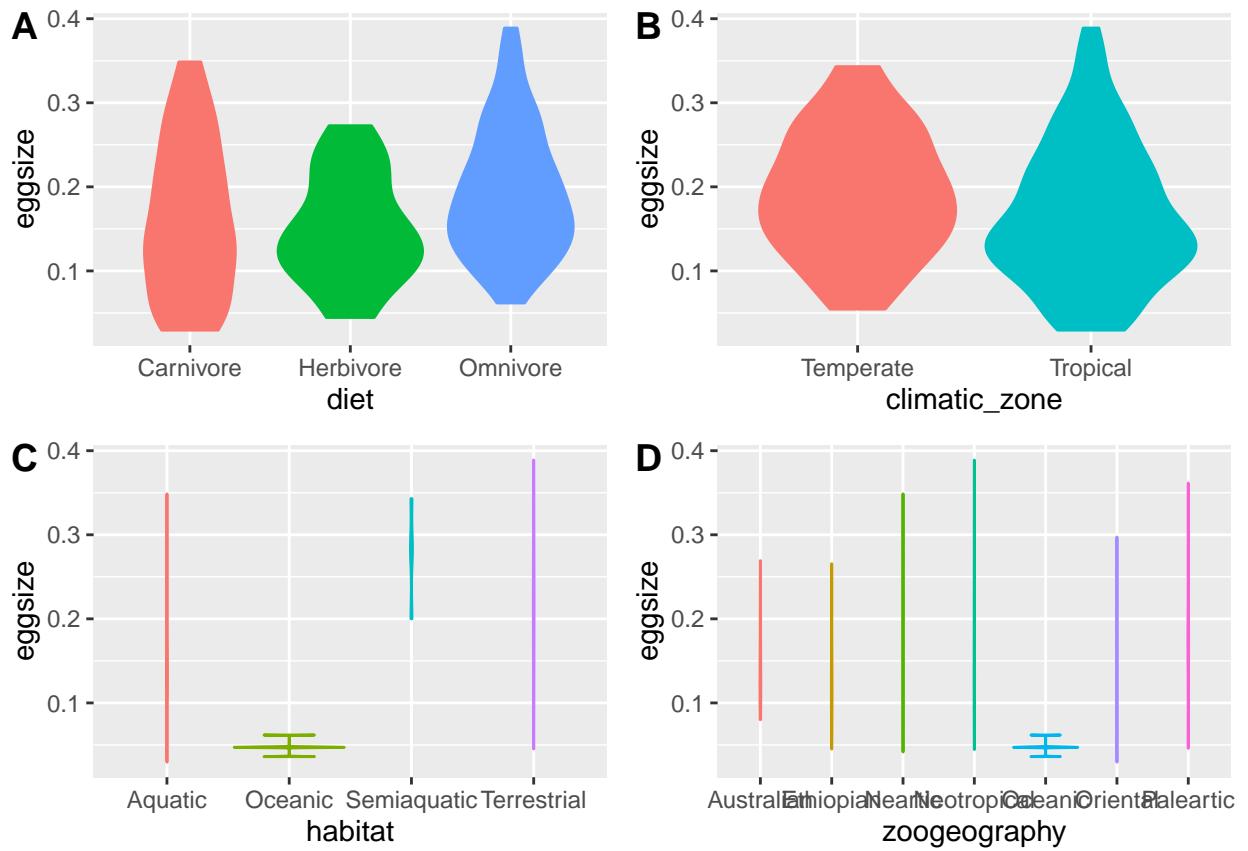


```
## Object of class "contMap" containing:  
##  
## (1) A phylogenetic tree with 173 tips and 172 internal nodes.  
##  
## (2) A mapped continuous trait on the range (1, 140).
```

You can't plot fecundity due to many NAs

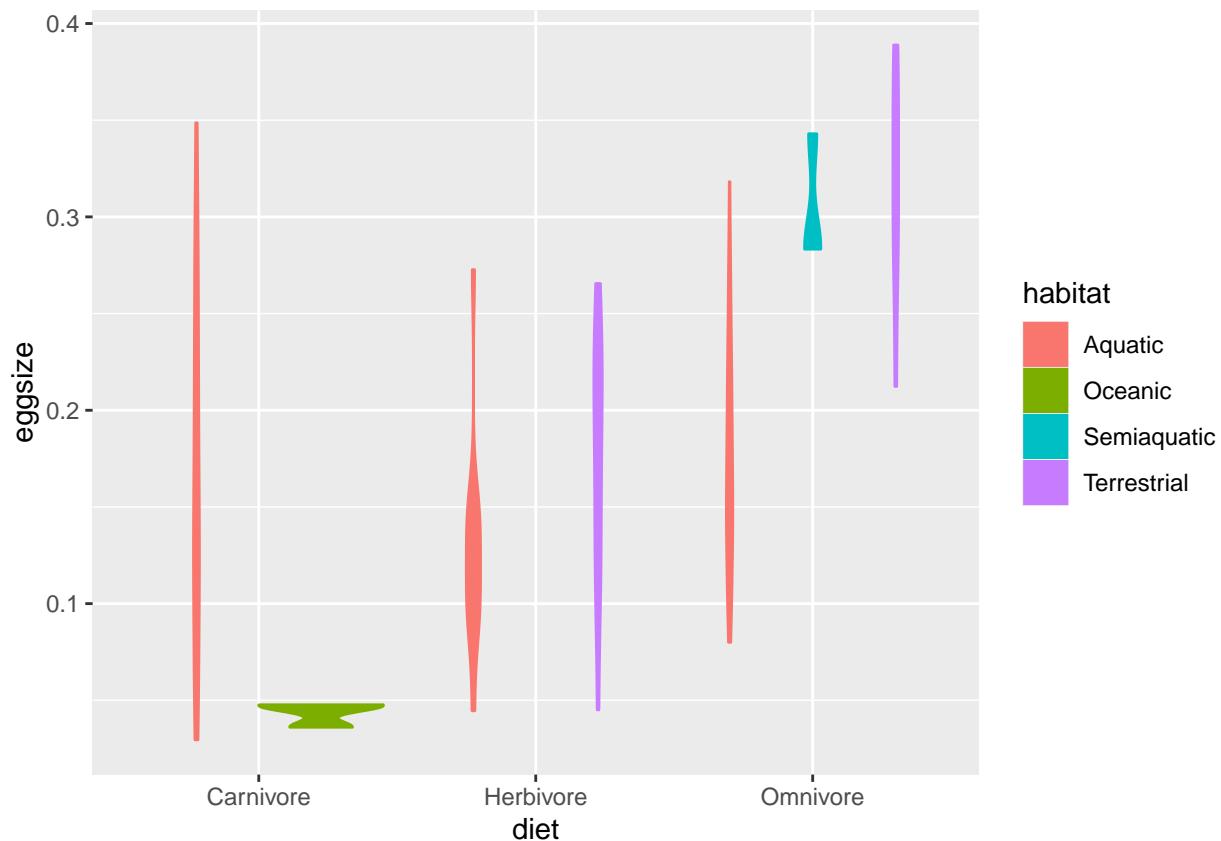
## Plotting categorical predictors

```
a <- ggplot(tidy_data$dat, aes(diet, eggsizes))+
  geom_violin(aes(col=diet, fill=diet))+  
  theme(legend.position = "none")  
  
b <- ggplot(tidy_data$dat, aes(habitat, eggsizes))+
  geom_violin(aes(col=habitat, fill=habitat))+  
  theme(legend.position = "none")  
  
c <- ggplot(tidy_data$dat, aes(climatic_zone, eggsizes))+
  geom_violin(aes(col=climatic_zone, fill=climatic_zone))+  
  theme(legend.position = "none")  
  
d <- ggplot(tidy_data$dat, aes(zoogeography, eggsizes))+
  geom_violin(aes(col=zoogeography, fill=zoogeography))+  
  theme(legend.position = "none")  
  
plot grid(a,c,b,d, labels = "AUTO")
```



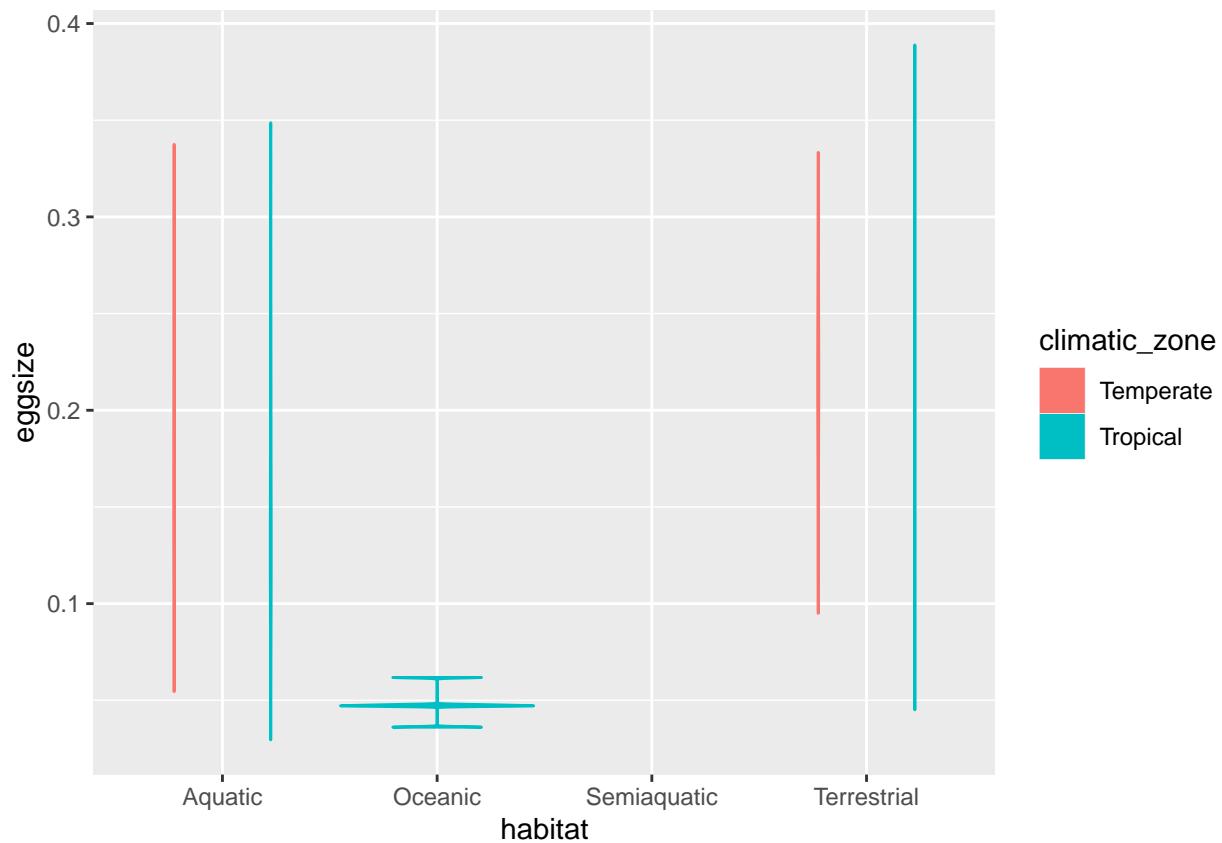
now including the interaction of habitat with other variables

```
ggplot(tidy_data$dat, aes(diet, eggsize))+
  geom_violin(aes(col=habitat, fill=habitat))
```



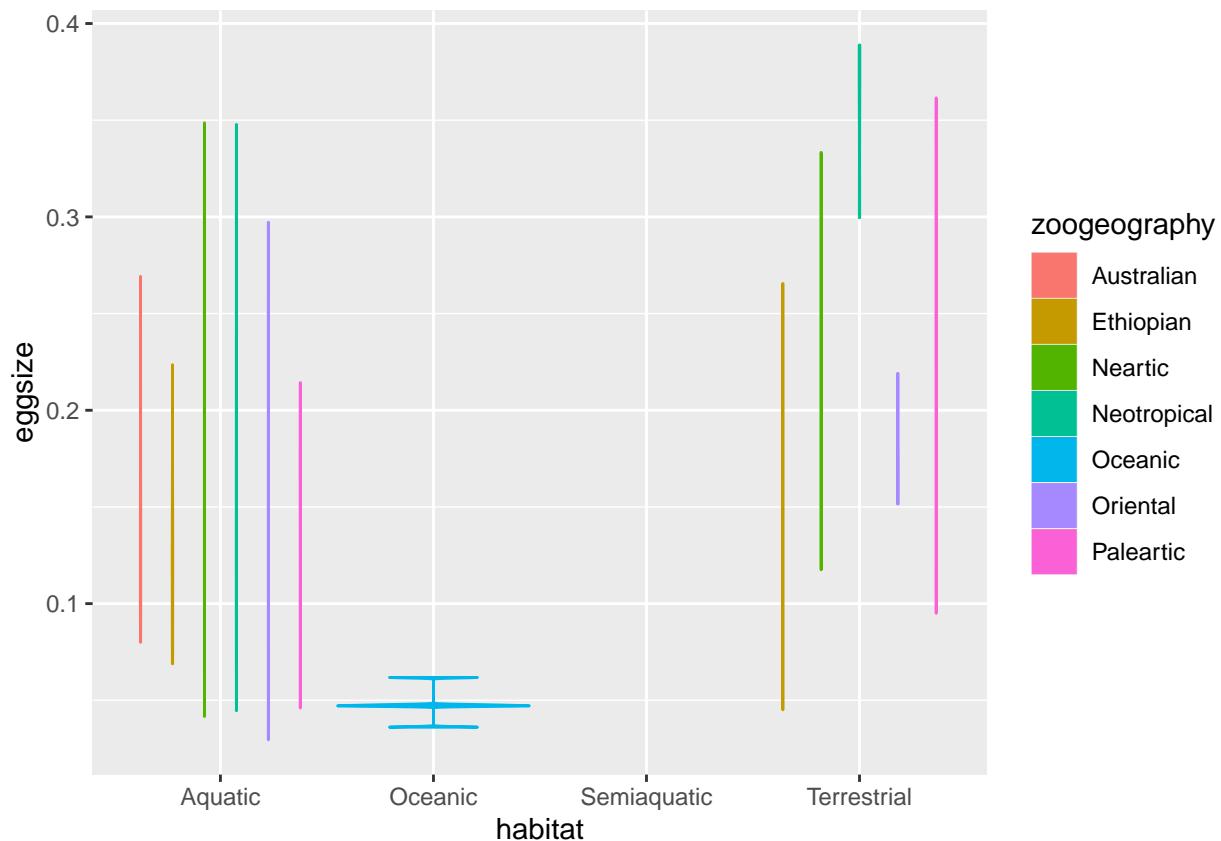
lacks combinations of crossed observation. Carnivores only occur in Aquatic and Oceanic habitats. So, you can't include those two variables in the same model

```
ggplot(tidy_data$dat, aes(habitat, eggsizes))+
  geom_violin(aes(col=climatic_zone, fill=climatic_zone))
```



same problem here between habitat and climatic zone, you don't have complete crossing of these two factors

```
ggplot(tidy_data$dat, aes(habitat, eggsize))+
  geom_violin(aes(col=zoogeography, fill=zoogeography))
```



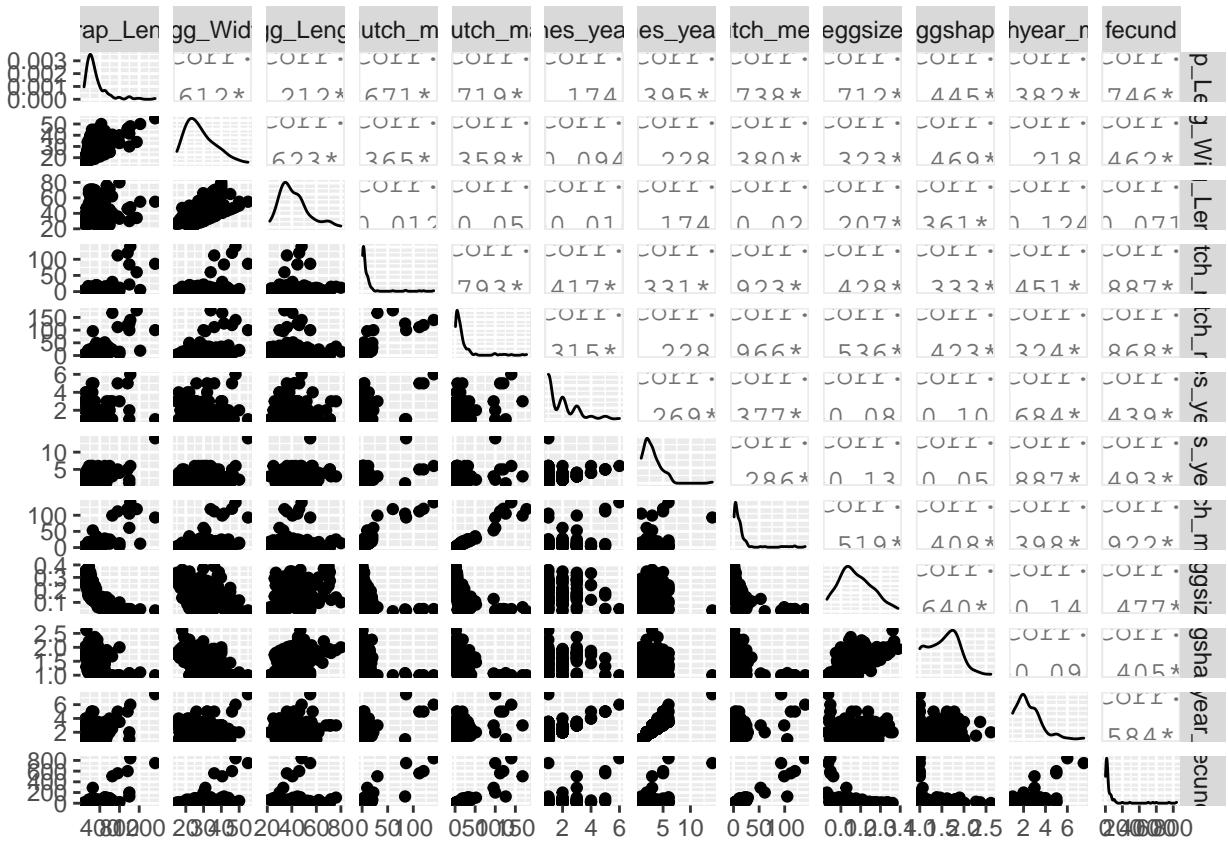
and again, the same problem with zoogeography, you don't have semiaquatic species in any zoogeographical zone.

actually, the problem is with the "semiaquatic" level of the factor habitat, with only 3 species. You should collapse this level with another level if you want to continue using 'habitat' in your models. See `forcats::fct_collapse`

## Understanding the distribution of the data

### Continuous response data

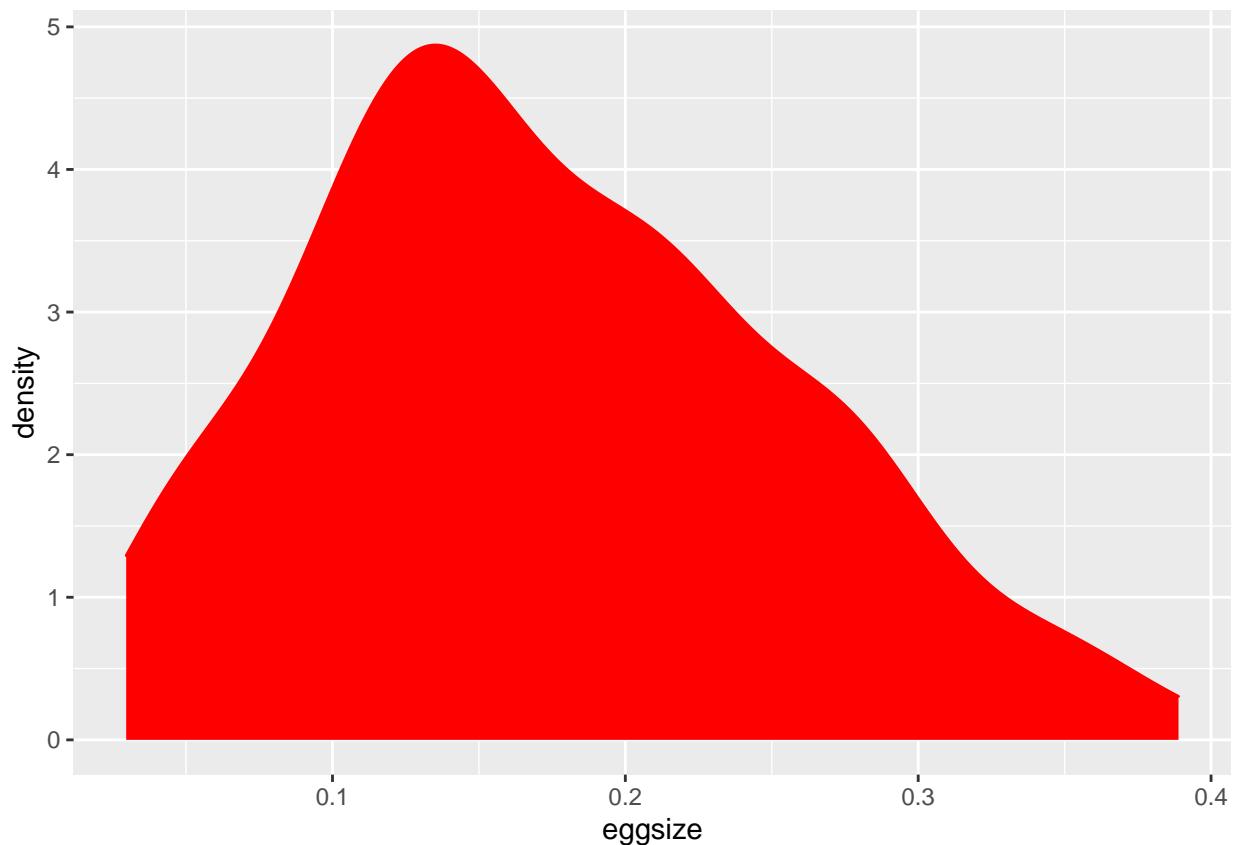
```
ggpairs(tidy_data$dat[,c(2, 5:15)]) #with only the quantitative variables
```



```
range(tidy_data$dat$eggsize)
```

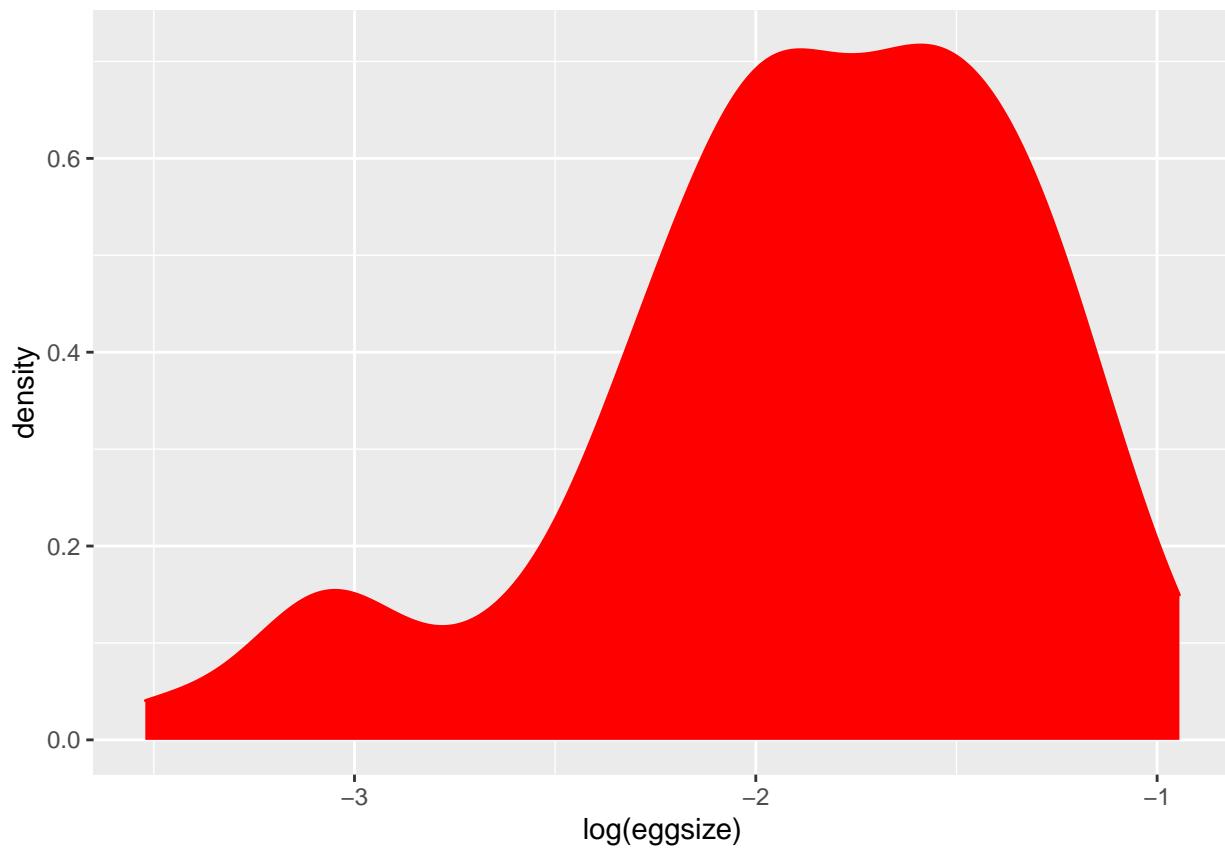
```
## [1] 0.02956522 0.38888889
```

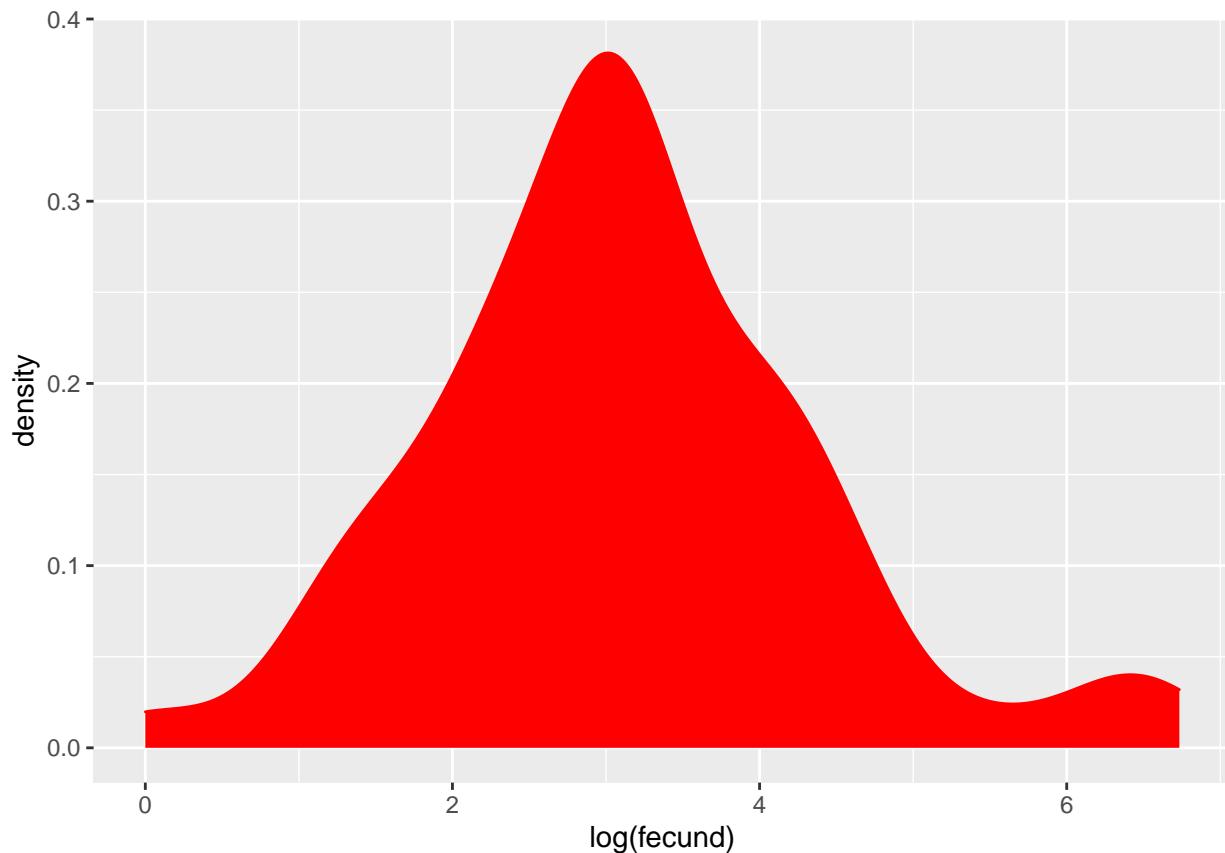
```
ggplot(tidy_data$dat, aes(eggsize))+
  geom_density(col="red", fill="red")
```



seems pretty Gaussian to me

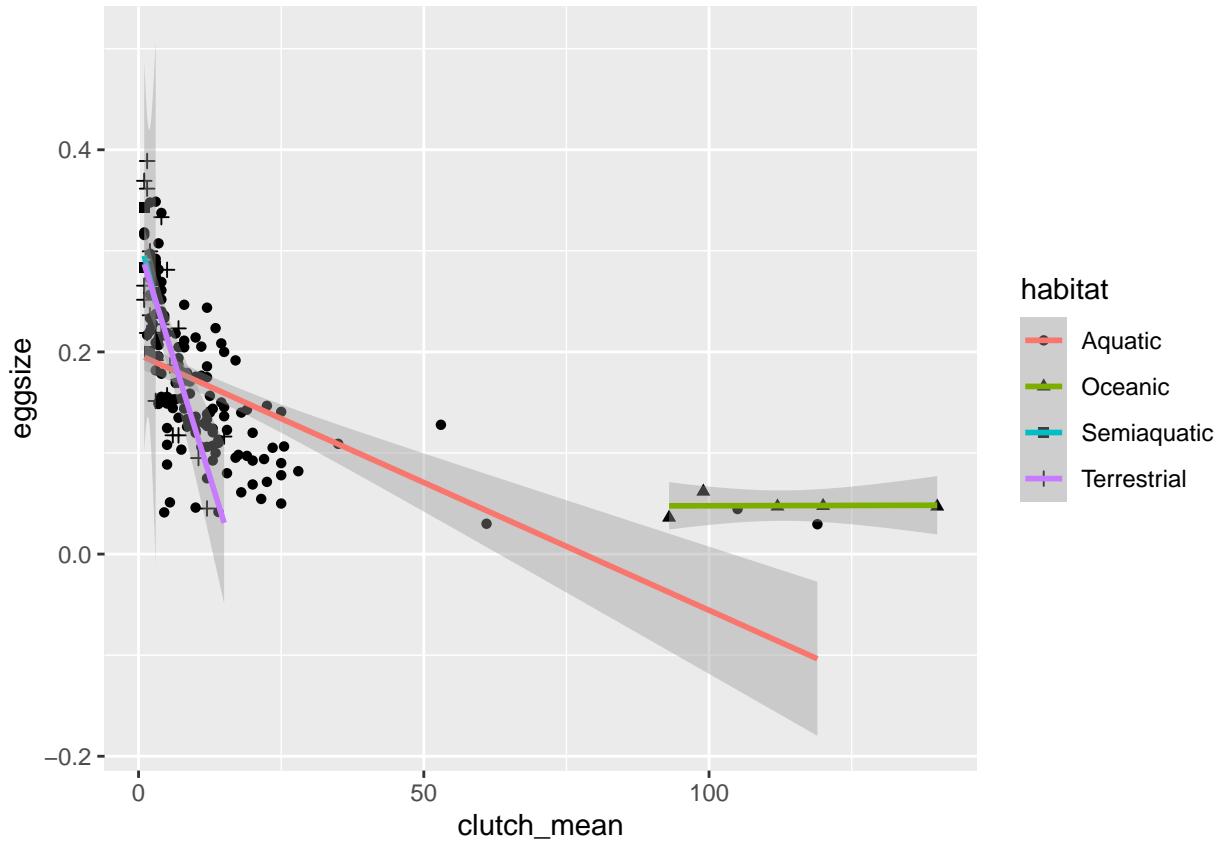
```
ggplot(tidy_data$dat, aes(log(eggsize)))+
  geom_density(col="red", fill="red")#with log
```





```
ggplot(tidy_data$dat, aes(clutch_mean, eggsizes))+
  geom_point(aes(shape=habitat)) +
  stat_smooth(method = "lm", aes(col=habitat))

## `geom_smooth()` using formula 'y ~ x'
```



## Inferential data analysis

Building a PGLS for egg size, following Revell (2010)

```
#mod1 <- gls(eggsize ~ climatic_zone + zoogeography + habitat + diet + clutch_mean, data = tidy_data$dat)
```

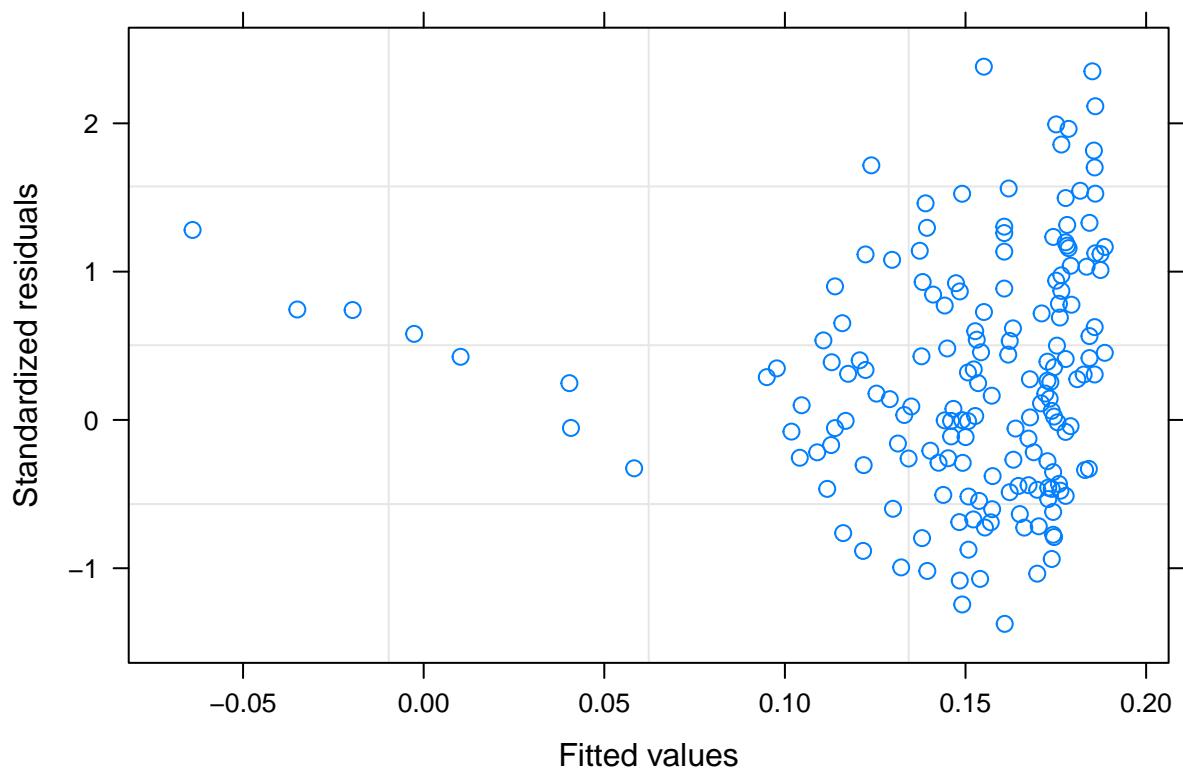
Uncomment this line above and run it. Including habitat makes the model a perfect fit, and returns an error  
– see why above

```
mod1_n <- gls(eggsize ~ climatic_zone + zoogeography + diet + clutch_mean, data = tidy_data$dat, corr=
```

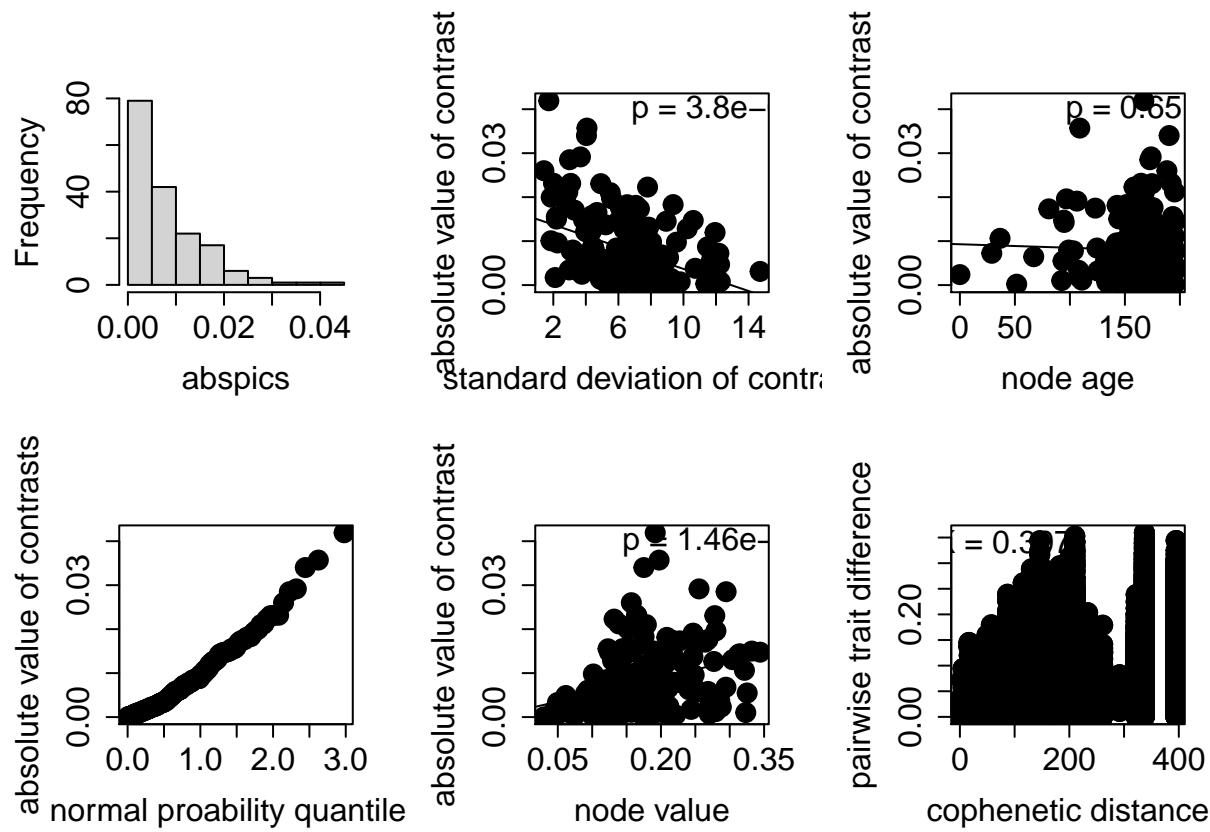
Now it works just fine

## Model diagnostics

```
plot(mod1_n)#not good, suggest heteroscedasticity, I'd remove some predictor variables
```



```
diagnostics(tidy_data$dat$eggsize,tidy_data$phy )
```



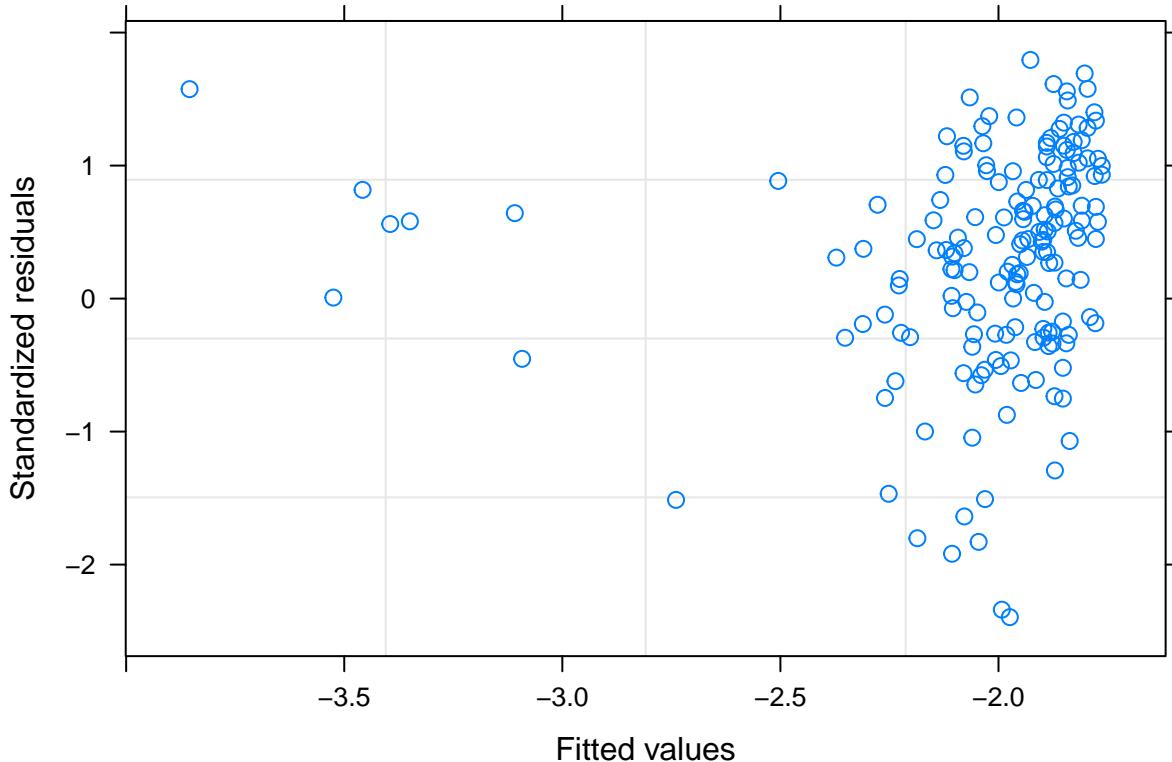
Trying log transformation

```

mod1_nlog <- gls(log(eggsize) ~ climatic_zone + zoogeography + diet + clutch_mean, data = tidy_data$dat)

plot(mod1_nlog)#not good, suggest heteroscedasticity. log transforming doesn't solve the problem

```



```

####Inference
summary(mod1_n)

## Generalized least squares fit by REML
##   Model: eggsize ~ climatic_zone + zoogeography + diet + clutch_mean
##   Data: tidy_data$dat
##          AIC      BIC    logLik
##     -428.1973 -388.0586 227.0987
##
## Correlation Structure: corPagel
##   Formula: ~1
## Parameter estimate(s):
##   lambda
## 0.8286825
##
## Coefficients:
##                               Value Std.Error t-value p-value
## (Intercept) 0.18555364 0.05058301 3.668300 0.0003
## climatic_zoneTropical 0.00038288 0.01173744 0.032620 0.9740
## zoogeographyEthiopian -0.01581689 0.04902075 -0.322657 0.7474
## zoogeographyNeartic -0.00258257 0.04649313 -0.055547 0.9558
## zoogeographyNeotropical -0.00762118 0.04476729 -0.170240 0.8650
## zoogeographyOceanic 0.00433869 0.07960488 0.054503 0.9566
## zoogeographyOriental -0.02961000 0.04840410 -0.611725 0.5416
## zoogeographyPaleartic -0.03767108 0.04887156 -0.770818 0.4419

```

```

## dietHerbivore      -0.02918845 0.02268577 -1.286642  0.2001
## dietOmnivore       0.00921903 0.01827596  0.504435  0.6146
## clutch_mean        -0.00160761 0.00037161 -4.326051  0.0000
##
## Correlation:
##                               (Intr) clmt_T zgggrpE zggphyNr zggphyNt zggphyOc
## climatic_zoneTropical -0.159
## zoogeographyEthiopian -0.655 -0.055
## zoogeographyNeartic   -0.689  0.062  0.823
## zoogeographyNeotropical -0.661 -0.089  0.819  0.913
## zoogeographyOceanic    -0.365 -0.100  0.495  0.534      0.536
## zoogeographyOriental   -0.650 -0.115  0.865  0.860      0.856      0.543
## zoogeographyPaleartic  -0.666  0.044  0.838  0.872      0.837      0.507
## dietHerbivore         -0.207 -0.011  0.081  0.117      0.093      0.143
## dietOmnivore          -0.204 -0.002  0.126  0.094      0.066      0.107
## clutch_mean           -0.102  0.077 -0.015 -0.014     -0.034     -0.479
##                               zggphyOr zgggrpP dtHrbv dtOmnv
## climatic_zoneTropical
## zoogeographyEthiopian
## zoogeographyNeartic
## zoogeographyNeotropical
## zoogeographyOceanic
## zoogeographyOriental
## zoogeographyPaleartic  0.904
## dietHerbivore         0.123     0.118
## dietOmnivore          0.124     0.088  0.566
## clutch_mean           -0.057    -0.017 -0.120 -0.039
##
## Standardized residuals:
##             Min      Q1      Med      Q3      Max
## -1.3750449 -0.3047387  0.2481882  0.8452372  2.3820883
##
## Residual standard error: 0.08667411
## Degrees of freedom: 173 total; 162 residual
anova(mod1_n) #diet and clutch mean are significant

## Denom. DF: 162
##              numDF   F-value p-value
## (Intercept)      1 16.865510  0.0001
## climatic_zone    1  0.038219  0.8452
## zoogeography      6  1.585702  0.1544
## diet              2  3.026165  0.0513
## clutch_mean      1 18.714721 <.0001
R2(mod1_n) #35% of explanation

##      R2_lik  R2_resid  R2_pred
## 0.3507843 0.6214566 0.6270314

```

## Visualizing the results

```
tidy_data$dat$predlm <- predict(mod1_n)
```

```

ggplot(tidy_data$dat, aes(clutch_mean, fecund))+  

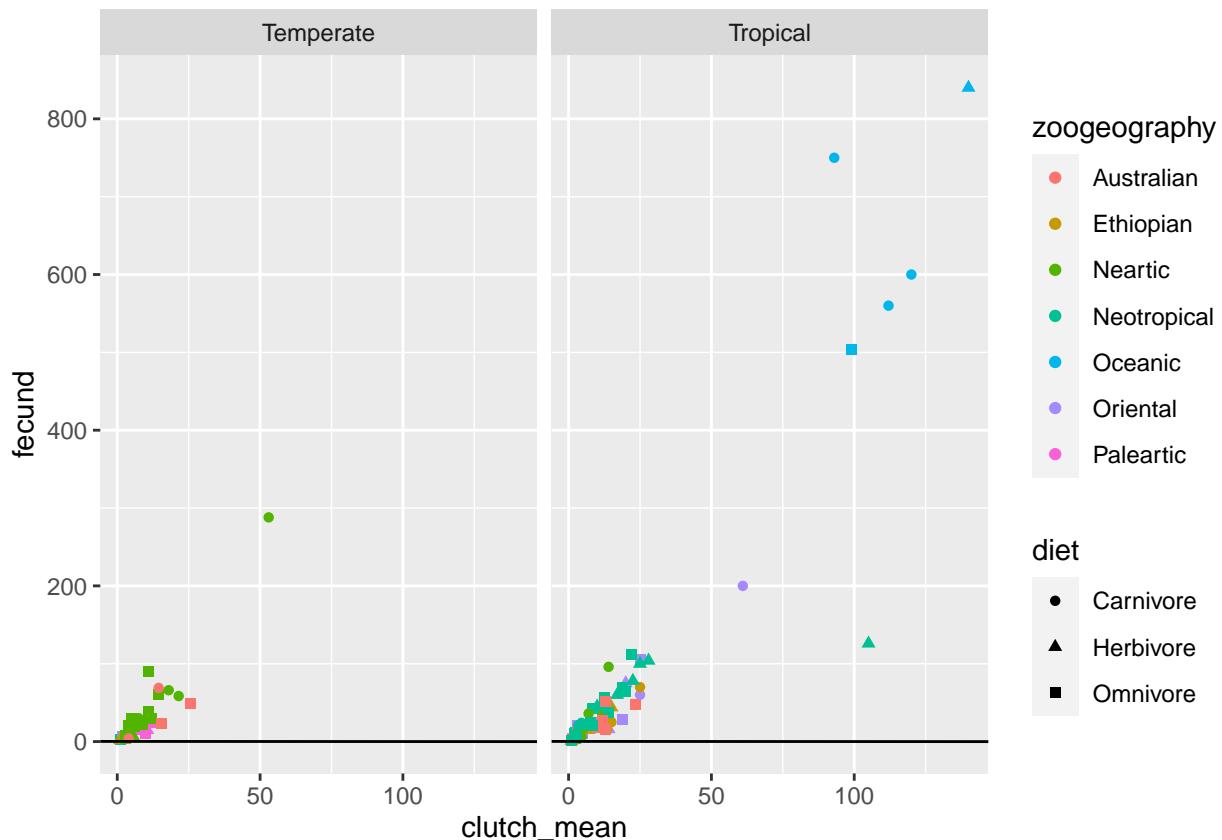
  geom_point(aes(col=zoogeography, shape=diet))+  

  geom_abline(slope = coef(mod1_n)[[1]], intercept = coef(mod1_n)[[1]])+#predicted by the PGLS  

  facet_wrap(vars(climatic_zone))

```

## Warning: Removed 55 rows containing missing values (geom\_point).



```

ggplot(tidy_data$dat, aes(clutch_mean, fecund))+  

  geom_point(aes(col=zoogeography, shape=diet))+  

  stat_smooth(method = "lm")+#linear model  

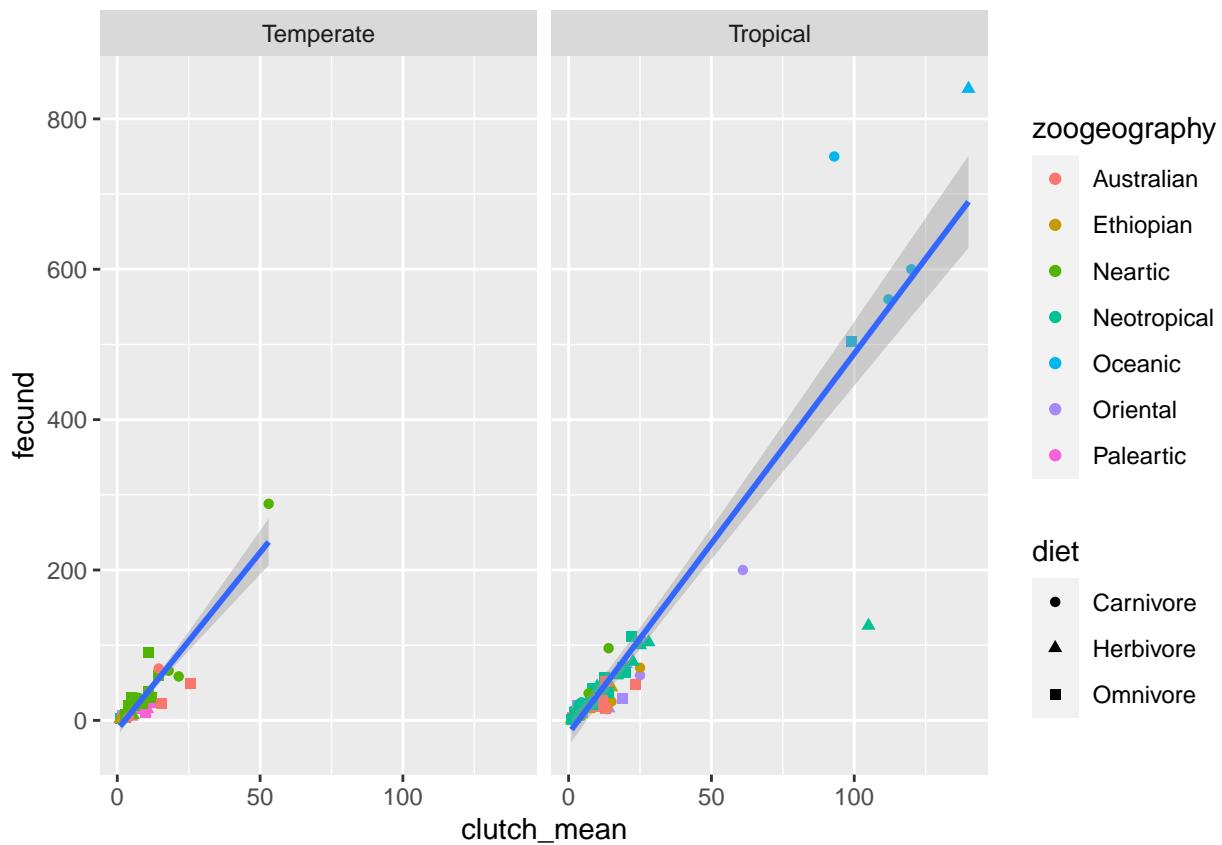
  facet_wrap(vars(climatic_zone))

```

## `geom\_smooth()` using formula 'y ~ x'

## Warning: Removed 55 rows containing non-finite values (stat\_smooth).

## Warning: Removed 55 rows containing missing values (geom\_point).



If you want a effect size measure, assuming BM though, results will be different

```
summary(geomorph::procD.pgls(eggsize ~ climatic_zone + zoogeography + diet + clutch_mean, data = tidy_0))
```

```
##  
## Preliminary Model Fit...  
##  
##  
## Coefficients estimation: 1000 permutations.  
## |
```

```

## Total          172 0.0210539
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Call: procD.lm(f1 = f1, iter = iter, seed = seed, RRPP = TRUE, SS.type = SS.type,
##                 effect.type = effect.type, int.first = int.first, Cov = Cov,
##                 data = data, print.progress = print.progress)

```

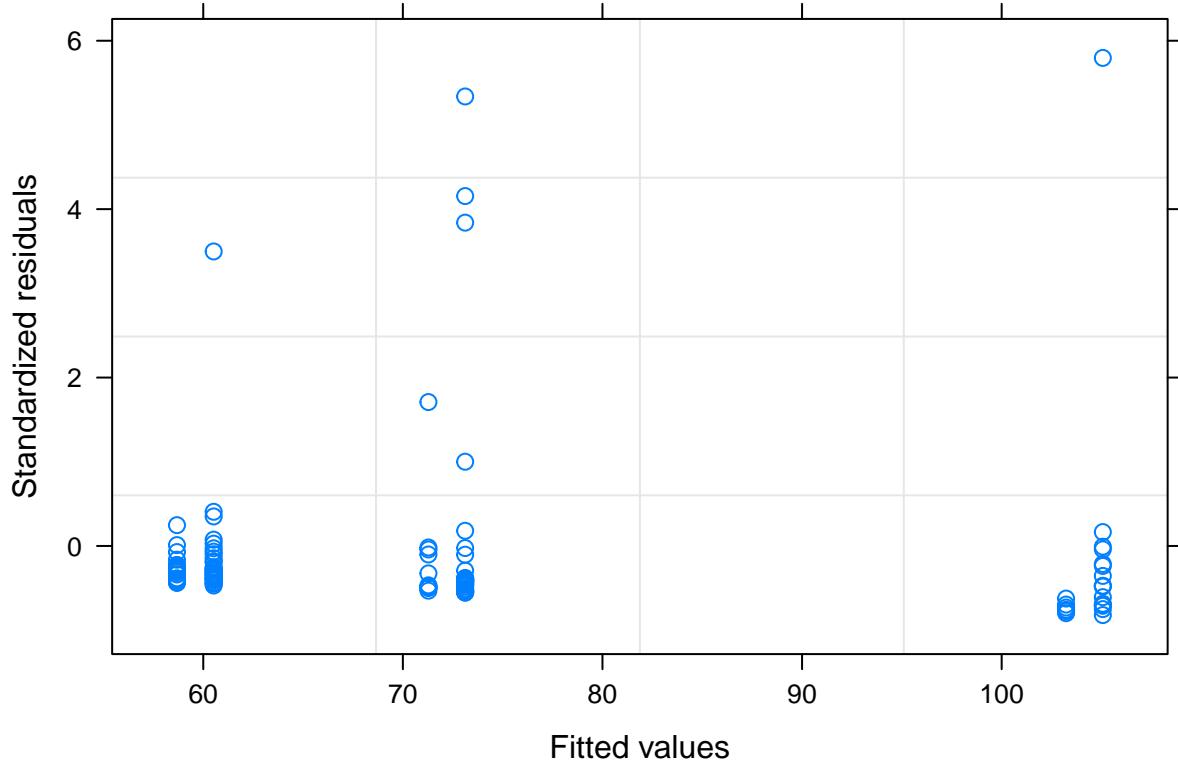
## Model building for the fecundity

```
mod_fecund <- gls(fecund ~ climatic_zone + diet, data = tidy_data2$dat, correlation = corPagel(1, tidy
```

Including zoogeography in the model returns an error, see explanation why down below.

## Diagnostics

```
plot(mod_fecund)
```



## Inference

```
anova(mod_fecund) #zoogeography significant
```

```

## Denom. DF: 114
##                  numDF   F-value p-value
## (Intercept)      1 2.1278144  0.1474
## climatic_zone    1 0.0322028  0.8579

```

```

## diet          2 1.2479105 0.2910
R2(mod_fecund) #95% of explanation

##      R2_lik   R2_resid   R2_pred
## 0.8744505 0.8093160 0.8489848

```

## Visualizing results

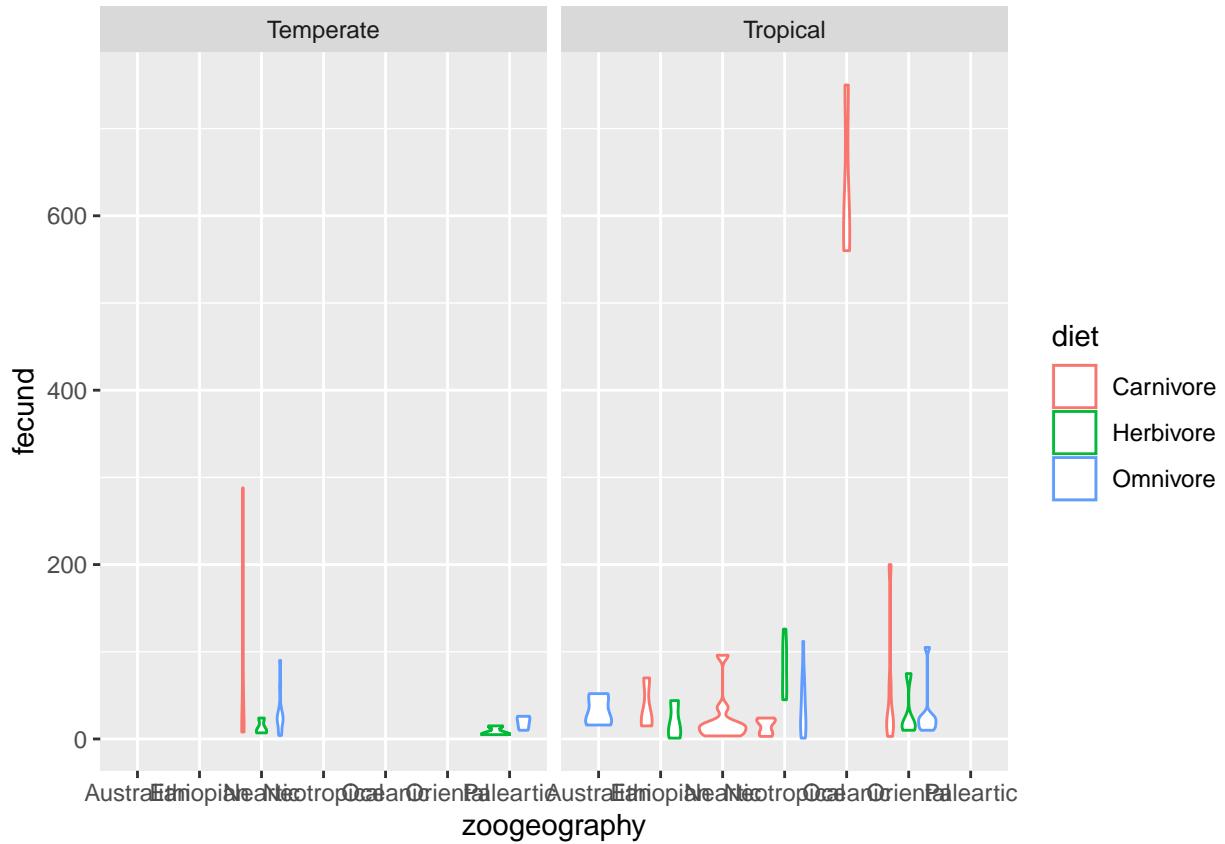
```

ggplot(tidy_data2$dat, aes(zoogeography, fecund))+  

  geom_violin(aes(col=diet))+  

  facet_wrap(vars(climatic_zone))

```



Again you have certain factor levels without replicates in both temperate and tropical. This makes very much sense since some zoogeographical areas only exist in the temperate realm, while other are fully tropical. So consider removing either of those factors from your model.