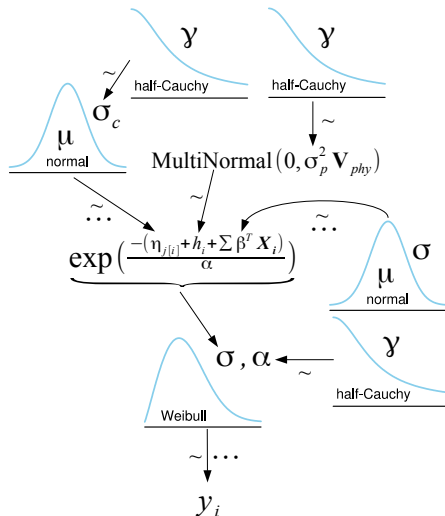


Death and taxa: time invariant differences in mammal species duration

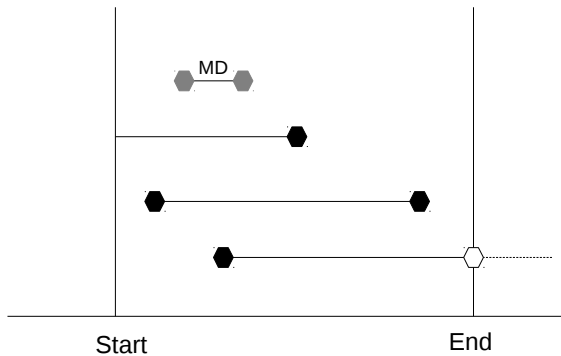
# North American survival

- ▶ species duration as measure of survival
- ▶ traits of interest
  - ▶ organismal: diet, locomotor categories
  - ▶ species: body size, bioprovince occupancy
- ▶ origination cohort
- ▶ phylogeny primarily based on taxonomy
- ▶ duration defined as number of 2My bins from FAD to LAD, inclusive
- ▶ fully Bayesian hierarchical model
- ▶ censoring approach
  - ▶ if still extant, right censored
  - ▶ if not extant and duration of only 1 bin, left censored

# Model diagram



# Censoring



# Modeling censored observations

## Definition

$$S(t|\alpha, \sigma) = \exp\left(-\left(\frac{t}{\sigma}\right)^\alpha\right)$$

Right censored evaluated at  $S(t)$ , left at  $1 - S(t)$ .

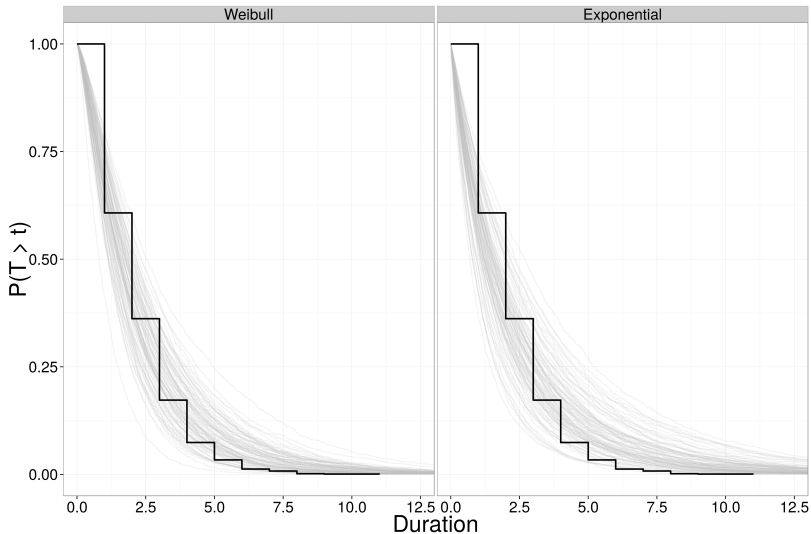
Equivalent to ccdf and cdf respectively.

# Modeling censored observations

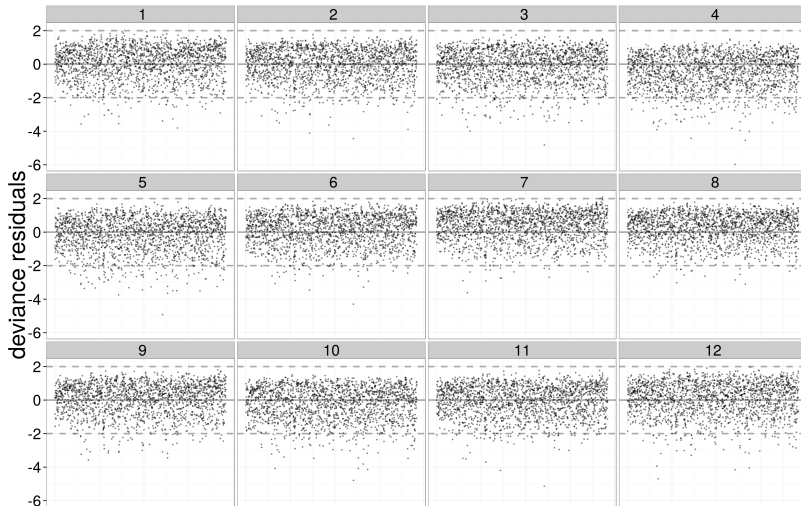
Likelihood

$$L \propto \prod_{i \in C} \text{Weibull}(y_i | \alpha, \sigma) \prod_{j \in R} S(y_j | \alpha, \sigma) \prod_{k \in L} (1 - S(y_k | \alpha, \sigma))$$

# Posterior predictive checks: $S(t)$

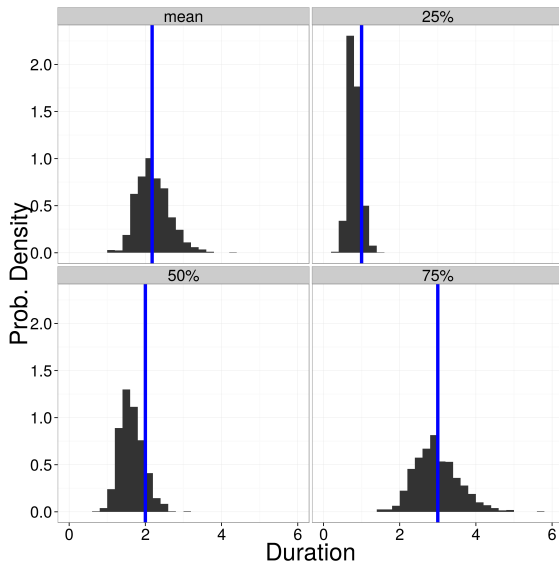


# Posterior predictive checks: deviance residuals

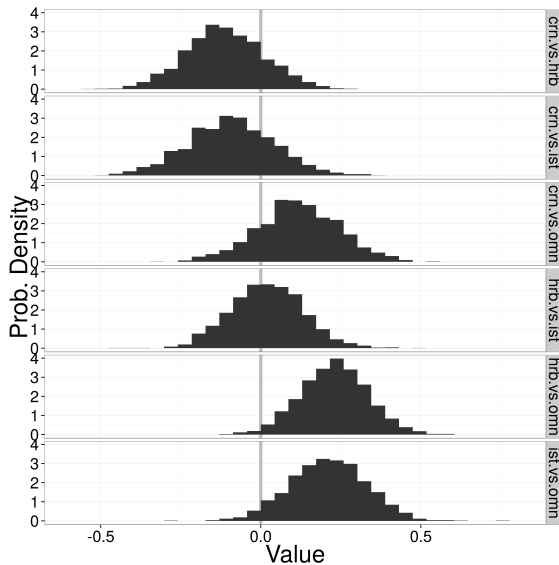




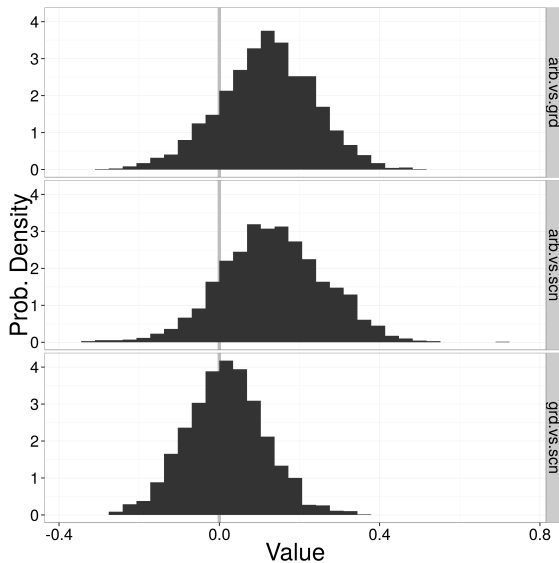
# Posterior predictive checks: point checks



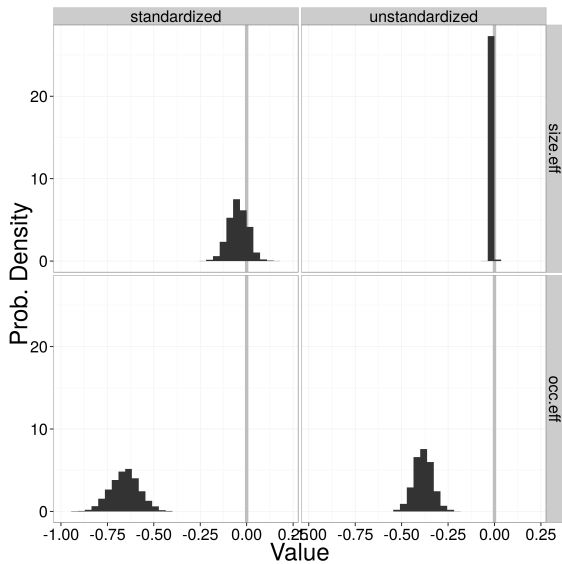
# Pairwise differences of $\beta$ , dietary category



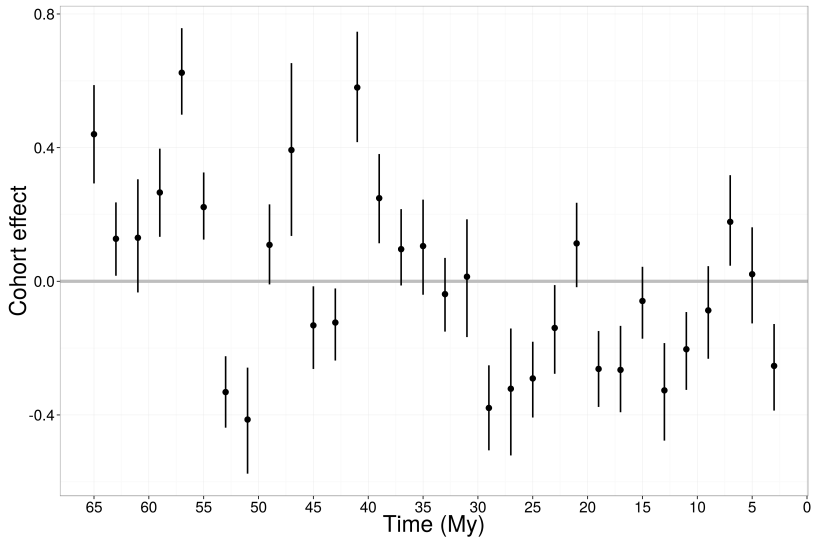
# Pairwise differences of $\beta$ , locomotor category



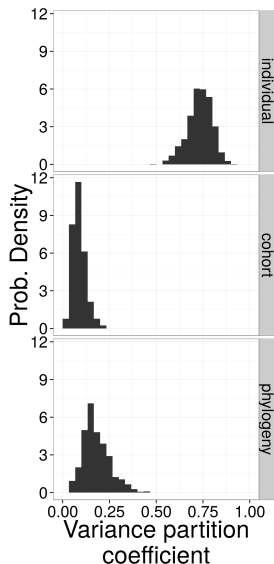
# Other traits



# Cohort effect

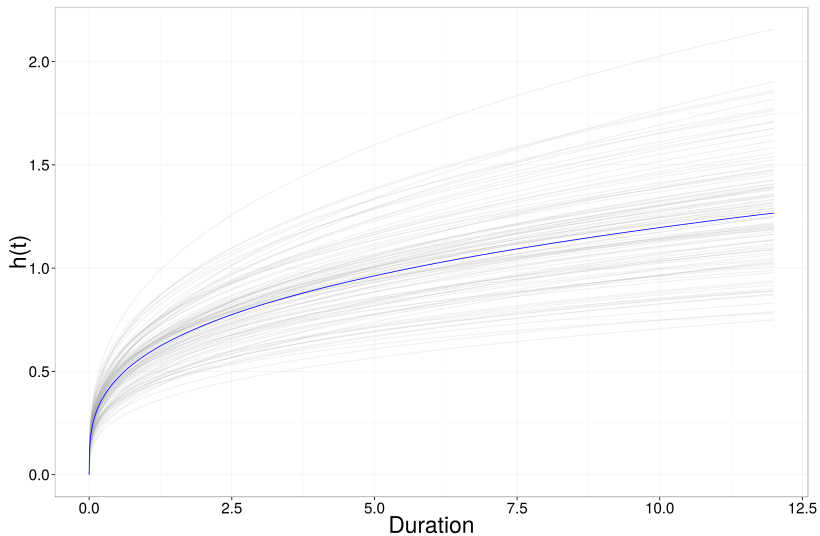


# Variance partition coefficient



- ▶ VPC approximated via simulation modified from Goldstein *et al.* '02 *Understanding Statistics*
- ▶ phylogenetic heritability, *sensu* Lynch '91 *Am. Nat.*, is a special case of VPC.

# Hazard curvature



# Meaning

## Results

- ▶ model adequate
- ▶ comparable probabilistic statements of trait, temporal, and historical effects
  - ▶ individual level is major source of variance
  - ▶ phylogenetic, cohort effect similar
- ▶ weak decreasing cohort survival risk over Cenozoic
- ▶  $h(t)$  not constant over  $t$ , increases slowly

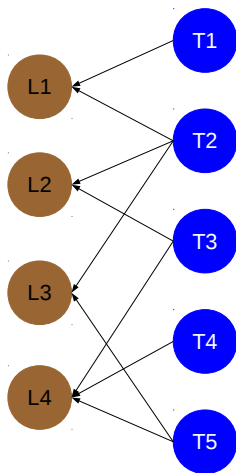
## Interpretation

- ▶ non-zero temporal and historical effects, but very small
  - ▶ older lineages out-competed by younger (Wagner and Estabrook '14 *PNAS*)
- ▶ increasing extinction with group age (Quental and Marshall '13 *Science*)
- ▶ background extinction; no single mode of extinction
- ▶ relative effect of universality of covariate, levels of selection(?)

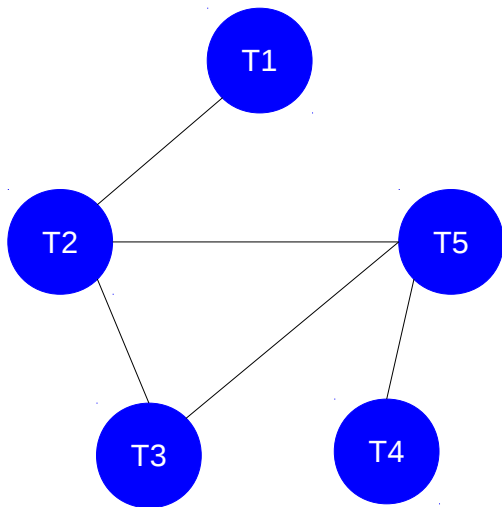


A model of biological and phylogenetic effects on Cenozoic mammal co-occurrence

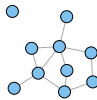
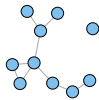
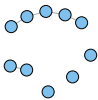
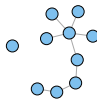
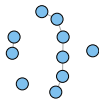
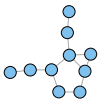
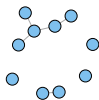
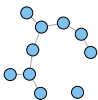
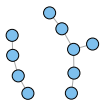
# Biogeographic network



## Species adjacency



# Erdos-Renyi graph $G(n, p)$



# Overdispersion model

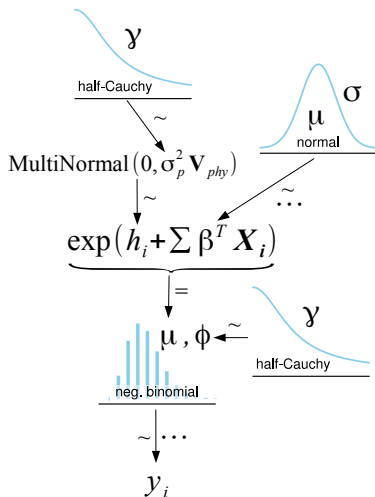
## Negative Binomial

$$\text{NegBinom}(y|\alpha, \beta) = \binom{y + \alpha - 1}{\alpha - 1} \left( \frac{\beta}{\beta + 1} \right)^2 \left( \frac{1}{\beta + 1} \right)^y$$

reparameterized

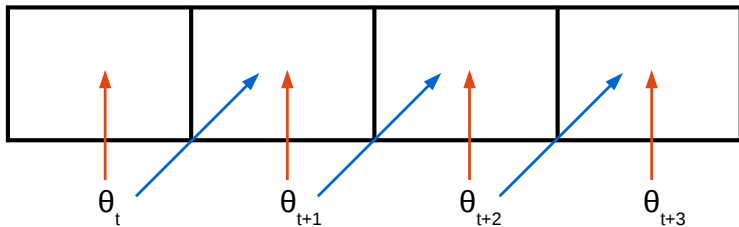
$$\text{NegBinom}(y|\mu, \phi) = \binom{y + \phi - 1}{y} \left( \frac{\mu}{\mu + \phi} \right)^y \left( \frac{\phi}{\mu + \phi} \right)^\phi$$

# Model diagram



$$\begin{aligned}
 y_i &\sim \text{NegBinom}(\mu, \phi) \\
 \phi &\sim \text{half-Cauchy}(2.5) \\
 h_i &\sim \text{MultiNormal}(0, \Sigma_p) \\
 \Sigma_p &= \sigma_p^2 \mathbf{V}_{phy} \\
 \sigma_p &\sim \text{half-Cauchy}(2.5) \\
 \beta &\sim \text{Normal}(0, 10)
 \end{aligned}$$

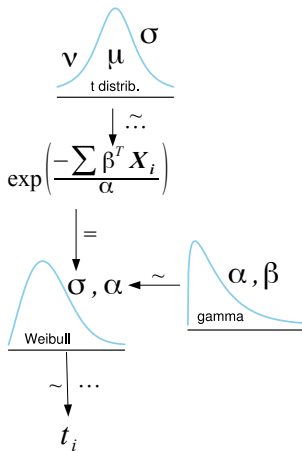
# Analysis framework



Gambling with Australian brachiopods



# Current brachipod survival model



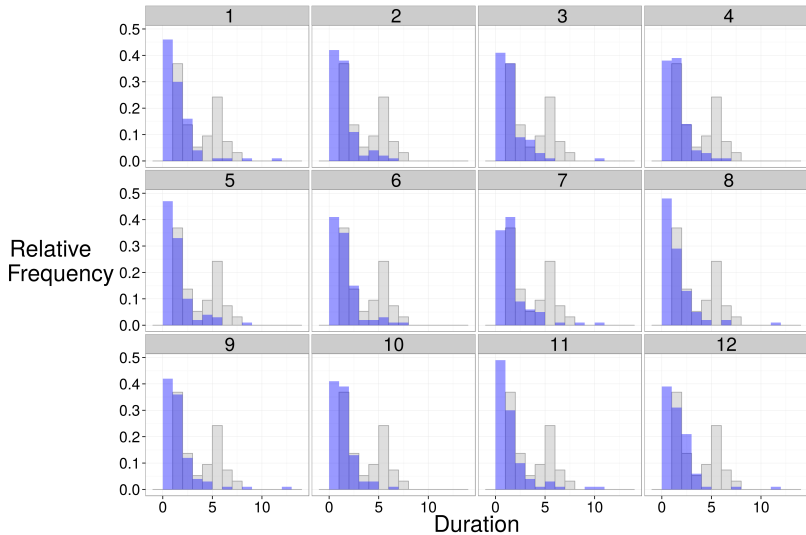
$$t_i \sim \text{Weibull}(\sigma, \alpha)$$

$$\sigma = \exp\left(\frac{-\sum \beta^T X_i}{\alpha}\right)$$

$$\beta \sim \text{Student } t(4, 0, 100)$$

$$\alpha \sim \text{Gamma}(1, 0.0001)$$

# Current results...



New direction

# Counting process of fossil occurrence

Hierarchical Poisson model of absolute sighting rate.

# fossils (i) of genus (j) in order (k) in a stage  $\sim \text{Poisson}(\lambda_{k[j[i]]})$