Exercise on Probability Distributions

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Probabilities and Priors

This exercise will introduce some probability distributions that you may find useful in Capture-Mark-Recapture JAGS models (and beyond)

The task:

- ▶ your group will be assigned a probability distribution (and transformation)
- play with it in R (like a child)
- interview a colleague to try and elicit their prior belief about a cetacean population parameter e.g., through random number generation, e.g., hist(rbeta(n=10000,30.3,3))
- show & tell: report back and help your colleagues get-to-know this distribution

You may wish to report on how each parameter affects the...

- mean (expected value)
- variance (spread)
- skew (left/right)
- shape (heavy tailed, bell-shaped, convex/concave)

You may also want to report any intuitions or rule's-of-thumb you learn to help your colleagues elicit priors

- e.g., Normal: 68% of the probability density is within \pm 1 Standard Deviation (σ) of μ (i.e., values within 1σ are quite likely).
- e.g., Normal: only 5% of the probability density is outside 2 σ from μ . (i.e., values $> (\mu + 2\sigma)$ are quite unlikely.

Tools:

- ▶ the internet (wikipedia is GREAT for describing probability distributions)
- ▶ play with R

```
r <- rbeta(10000,shape1 = 20, shape2=10)
hist(r) # visualize
quantile(r, c(0.05, 0.5, 0.95)) # 0.05th,0.50th,0.95th quantiles!
... repeat...
r <- rbeta(10000,shape1 = 10, shape2=20)
hist(r) # visualize
quantile(r, c(0.05, 0.5, 0.95)) # 0.05th,0.50th,0.95th quantiles!</pre>
```

It's your prior beliefs!

Remember, it's <u>your</u> prior belief You must learn to express yourself <u>probabilistically</u>

Warning: JAGS vs R

R and JAGS have slightly different parameterizations for some distributions. Especially, the Normal and Student-t

- ▶ in R: dnorm(x, mean, sd) or $\mathcal{N}(x; \mu, \sigma)$
- ▶ in JAGS: dnorm(x, mean, precision) or

$$\mathcal{N}(x;\mu, au),$$
 where $au=rac{1}{\sigma^2}$

lacktriangle Student-t: likewise, JAGS parameterizes the Student-t with $au=rac{1}{\sigma^2}$.

Files

▶ There are some helpful R functions in the file:

PART2_priors/R_source_distributions.R \dots copy and paste the code into R

Distributions

You will be assigned into teams of:

- ▶ Beta: rbeta
- ▶ |ogit-Norma|: rlnorm.jags
- ▶ probit-Normal: rpnorm.jags
- ▶ half-Normal: rhalfnorm.jags
- scaled-half-student-t: rhalft.jags
- ▶ Gamma: rgamma
- ▶ Inverse-Gamma: MCMCpack::rinvgamma

Advanced / if you get bored

- ▶ Inverse-Wishart: MCMCpack::riwish
- ▶ Dirichlet: MCMCpack::rdirichlet

Beta, logit-Normal, probit-Normal

for teams studying the Beta, logit-Normal, probit-Normal: pretend you are eliciting a prior for a probability parameter, such as

- ightharpoonup annual survival (ϕ) , or
- ightharpoonup probability of leaving the studying area and becoming a temporary emigrant for the next capture period (γ'') .

half-Normal, half-Student-t, Inverse-Gamma

for teams studying the <u>half-Normal</u>, <u>half-Student-t</u>, or <u>Inverse-Gamma</u>: pretend you are ellicting a prior for a . . .

- \blacktriangleright dispersion parameter (σ , for half-Normal and half-Student-t), or
- ▶ variance parameter (σ^2 , for Inv-Gamma), or
- precision parameter ($\tau = \frac{1}{\sigma^2}$, for Gamma).

In such cases, pretend your are elicting their prior beliefs about the *natural* variation of a parameter in time. For example:

Sheila: "Hey Gordie, how much do you think survival is likely to *vary* between years?"

Gordie: "Hmmm, I can't imagine it changes much more than"

Dirichlet

For team <u>dirichlet</u>, pretend you are elliciting a prior for a simplex of a <u>categorical</u> or <u>multinomial</u> distribution ¹.

E.g., for dolphins that live in the Perth river estuary, what are their probabilities of transitioning to:

- 1 a North Coast strata, or
- 2 a South Coast strata, or
- staying at home.

▶ or any multinomial outcome

¹like the probabilities governing the outcomes of a dice-rolling experiment ≥ → ✓ ≥ → ○ ◆