

## Homework 08

Math 315, Fall 2018

Due: Nov. 12 by 4 p.m.

*Instructions:* Complete the following problems and submit them by 4 p.m. on the due date. Please make sure that your solution is neatly written, clearly organized, and stapled (if there are multiple pages).

### Problem 1

In 1986, the space shuttle Challenger exploded during takeoff, killing the seven astronauts aboard. The explosion was a result of an O-ring failure, a splitting of a rubber ring that seals parts of the ship together. The accident was believed to be caused by the unusually cold weather (31°F) at the time of the launch, as there is reason to believe that the O-ring failure probabilities increase as the temperature decreases.

Data collected about O-rings on other shuttle launches include: temperature at flight time (in °F) and failure/success (0/1) of the O-ring for the flight at the given temperature. The temperatures range from 53°F to 81°F, with the majority of O-ring failures at the lower temperatures. Notice that the temperature at the Challenger launch was significantly lower than those studied in the given data.

```
challenger <- read.csv("https://aloy.rbind.io/data/challenger.csv")
```

- (a) Write down an expression for the likelihood and link function. See the model presented on page 293 of the textbook for an example.
- (b) Fit the model you specified in part (a) using the priors:  $\alpha \sim \mathcal{N}(0, 10)$  and  $\beta \sim \mathcal{N}(0, 5)$ . Fit this model using HMC via `map2stan()`, with the additional arguments `iter = 4000`, `warmup = 1000`, `chains = 2`. Be sure to run this model as a separate R script and save your results as outlined in class. Report the output from `precis()` as a **formatted** table, and explain how you know that the Markov chains produced by `map2stan()` converged to the stationary distribution.
- (c) Interpret the slope coefficient estimate in the context of the problem.
- (d) Calculate a 97% prediction interval for the probability of an O-ring failure at 31°F, the temperature at the time the Challenger launched.

- (e) Are you worried about the effective number of independent draws you have from the posterior distribution for each parameter? Why or why not?
- (f) Standardize `temp` and refit your logistic regression model using the same prior on  $\alpha$  and  $\beta \sim \mathcal{N}(0, 2)$ . Report the output from `precis()` as a **formatted** table. What do you notice about the effective number of independent draws you have from the posterior distribution for each parameter?

### Problem 2

Read the description of problem 10H3 in the textbook and complete the following:

- (a) Fit the model specified in 10H3 (a) using HMC via `map2stan()`. Be sure to run this model as a separate R script and save your results as outlined in class. Report the output from `precis()` as a **formatted** table, and explain how you know that the Markov chains produced by `map2stan()` converged to the stationary distribution.
- (b) Interpret each slope coefficient estimate in the context of the problem.
- (c) Create two plots displaying the posterior predictions:
  - (i) Plot the *probability of success* (on the y-axis) against the cases (on the x-axis). Add 89% credible intervals to the predicted probabilities. Additionally, add the empirical probabilities ( $y/n$ ) to this plot using a different plotting color and shape.
  - (ii) Plot the *number of successes* (on the y-axis) against the cases (on the x-axis). Add 89% credible intervals to the predicted number of successes. Additionally, add the observed number of successes to this plot using a different plotting color and shape.
- (d) Fit a model with an interaction between the pirate's size and age (immature or adult) using HMC via `map2stan()`. Report the output from `precis()` as a **formatted** table, and explain how you know that the Markov chains produced by `map2stan()` converged to the stationary distribution.
- (e) Compare this model to the previous model using WAIC. Report your findings.