STAT 578 – Advanced Bayesian Modeling – Fall 2019

Assignment 1

1. The film review aggregator website rottentomatoes.com publishes ranked lists of movies based on the number of positive critical reviews out of a total number counted for each movie. See, for example, https://www.rottentomatoes.com/top/bestofrt/?year=2018. Because the site uses an "Adjusted Score," a movie with a higher approval percentage sometimes ranks lower on the list.

Consider the following hypothetical scenario:

Movie 1: 150 positive reviews out of 200 (75%)

Movie 2: 4 positive reviews out of 5 (80%)

Assume that reviews of Movie i are independent with a common probability p_i of being positive (depending on the movie). Assume a U(0,1) prior on each p_i .

- (a) [4 pts] Determine the posterior distribution of p_1 and of p_2 (separately).
- (b) [3 pts] Which movie ranks higher according to posterior mean? According to posterior median? According to posterior mode? Show your computations. (For median, use R function qbeta. For mean and mode, use formulas in BDA3, Table A.1. Do *not* use simulation, as it may not be sufficiently accurate.)
- 2. File randomwikipedia.txt contains the ID number and number of bytes in length for 20 randomly selected English Wikipedia articles.
 - (a) (i) [2 pts] Draw a histogram of article length, and describe the distribution.
 - (ii) [2 pts] Transform article length to the (natural) log scale. Then re-draw the histogram and describe the distribution.
 - (iii) [1 pt] Based on your histograms, explain why the log scale would be better to use for the remainder of the analysis. (Read below.)
 - (b) [2 pts] Let y_i be length of article i on the log scale (i.e., the natural logarithm of the number of bytes). Compute the sample mean and sample variance of y_1, \ldots, y_{20} .

In the remaining parts, assume the y_i s have a normal sampling distribution with mean μ and variance σ^2 .

- (c) Assume σ^2 is known to equal the sample variance. Consider a flat prior for μ . Use it to:
 - (i) [3 pts] Compute the posterior mean, posterior variance, and posterior precision of μ .
 - (ii) [2 pts] Plot the prior density and the posterior density of μ together in a single plot. Label which is which.
 - (iii) [2 pts] Compute a 95% central posterior interval for μ .
- (d) Now let μ and σ^2 have prior

$$p(\mu, \sigma^2) \propto (\sigma^2)^{-1}$$
 $\sigma^2 > 0$

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Use it to:

- (i) [3 pts] Compute the posterior mean, posterior variance, and posterior precision of μ . (If you cannot compute explicitly, use a good computational approximation.)
- (ii) [2 pts] Approximate a 95% central posterior interval for μ .
- (iii) [2 pts] Approximate a 95% central posterior interval for σ^2 .
- (e) Assume the prior of the previous part. Use simulation in R to answer the following, based on 1,000,000 draws from the posterior.
 - (i) [2 pts] Approximate a 95% central posterior predictive interval for the length (in bytes) of a single (new) randomly drawn article. (Note that this is on the *original* scale, not the log scale.)
 - (ii) [2 pts] Approximate the posterior predictive probability that the length of a single (new) randomly drawn article will exceed the maximum article length in the data.
 - (iii) [2 pts] Approximate the posterior predictive probability that the maximum length of 20 (new) randomly drawn articles will exceed the maximum article length in the data. (Be careful! The 20 randomly drawn articles have the *same* value for μ and for σ^2 .)

Reminder: Show the R code you used and also a summary of the approximate inference results that you used to answer the preceding parts.

Total: 34 pts