STAT 578 - Advanced Bayesian Modeling - Fall 2018

Assignment 3

Use the 2016 US presidential polls data in polls2016.txt to answer the following, running all parts using JAGS and R (rjags). Remember that you will have to create a variable sigma in R to represent the standard deviation of the polls, defined to be half of the margin of error. Refer to Lesson 4.2: Normal Hierarchical Model in R/JAGS.

- (a) Use the model in polls20161.bug for the following:
 - (i) [2 pts] Create an initialization list (in R) supporting 4 chains, with a different initialization for each chain. Set initial values for mu to ±100 and values for tau to 100 or 0.01. Then use jags.model to create the JAGS model R object with these initializations. List all of the R code you used.
 - (ii) [2 pts] Perform a burn-in of 2500 iterations, then monitor the mu and tau nodes for 5000 iterations (for each chain). List all of the R code you used.
 - (iii) [3 pts] For the iterations you monitored, produce trace plots of mu and tau. Do there appear to be any convergence problems? Display the plots and R code that produced them.
 - (iv) [2 pts] For the iterations you monitored, compute Gelman-Rubin statistics (potential scale reduction factors) for mu and tau. Do there appear to be any convergence problems? Show your R code and its output.
 - (v) [2 pts] For the iterations you monitored, display autocorrelation plots for mu and tau for one of the chains. (Hint: For example, to reference the first chain of an mcmc.list object called x, use x[[1]].) Comment on the apparent speed of mixing.
 - (vi) [2 pts] For the iterations you monitored, compute effective sample sizes (over all chains) for mu and tau. Would they be considered adequate? Show your R code and its output.
- (b) Now consider a new model that uses an almost flat prior for tau on the log scale: Create a new JAGS model by modifying polls20161.bug to eliminate the current prior for tau, create a new parameter logtau with a U(-100, 100) distribution, and define tau to be exp(logtau).
 - (i) [2 pts] Display all of the code for your new JAGS model.
 - (ii) [2 pts] Create an initialization list (in R) supporting 4 chains, with a different initialization for each chain. Set initial values for mu to ±100 and values for logtau to log 100 or log 0.01. Then use jags.model to create the JAGS model R object with these initializations. List all of the R code you used.
 - (iii) [2 pts] Perform a burn-in of 2500 iterations, then monitor the mu and tau nodes for 5000 iterations (for each chain). List all of the R code you used.
 - (iv) [3 pts] For the iterations you monitored, produce trace plots of mu and tau. Do there appear to be any convergence problems? Display the plots and R code that produced them.
 - (v) [2 pts] For the iterations you monitored, compute Gelman-Rubin statistics (potential scale reduction factors) for mu and tau. Do there appear to be any convergence problems? Show your R code and its output.

- (vi) [2 pts] For the iterations you monitored, display autocorrelation plots for mu and tau for one of the chains.¹ Comment on the apparent speed of mixing.
- (vii) [2 pts] Suggest an explanation for the presence of any problems you noted. (Hint: What would happen if you used an improper flat prior on $\log \tau$?)

Total: 28 pts

Ordinarily, autocorrelation plots are not used for chains that have not converged, but you should produce them here even if there was no convergence.