Solution for this Computer Lab contains 3 files and content of all of them is located in <u>Appendix</u>: <u>misprints1.model</u>, <u>misprints2.model</u>, <u>misprints.R</u>.

Question 1

To show that the results obtained using JAGS model are identical to the ones found theoretically in the class we have plotted (Figure 1) density graph of JAGS model vs Theoretical model.

JAGS posterior Theoretical posterior

Comparison of JAGS model with Gamma(9,6) prior and Theoretical posterior

Figure 1. Comparison of JAGS model with Gamma(9,6) prior and Theoretical posterior

As we can see from the Figure 1 the two models align quite well. Additionally, we know that Theoretical posterior should be following Gamma(24,12) distribution therefore its mean is 2 and variance is 0.16667. Our JAGS model has mean of 2.004818 and variance of 0.1672128 which also confirms our findings.

Question 2

Figure 2 shows comparison between models with different priors: Gamma(9,6), Uniform(0,10) and Jeffreys' prior approximated by Gamma(0.5,0.00001). The most informative distribution is the one with Gamma(9,6) prior. We can also see that the two priors produce similar posterior distributions. The reason they are producing comparable results is that both of them are flat priors as it can be seen on Figure 3.

Comparison of JAGS models with Gamma(9,6), Uniform(0,10) and Jeffrey's priors

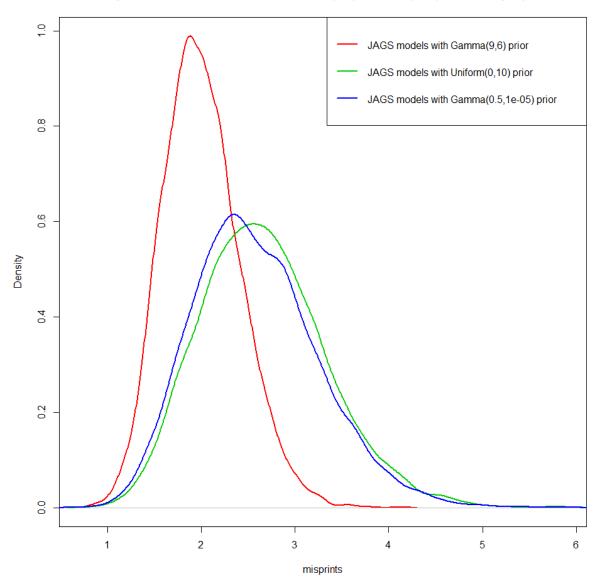


Figure 2. Comparison of JAGS models with 3 different priors

Plot of Uniform(0,10) and Jeffrey's prior

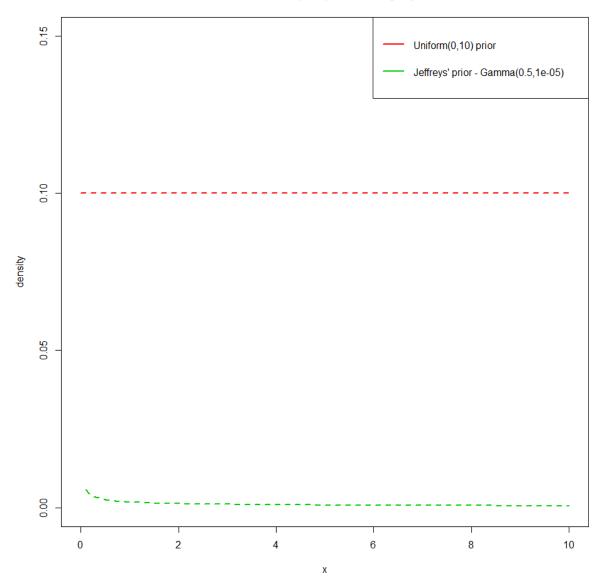


Figure 3. Plot of Uniform(0,10) and Jeffrey's prior

Question 3

From the Figure 4 we can see that the results are similar for a posterior whose prior distribution is posterior distribution from $\underbrace{\text{Question 1}}_{\text{Question 1}}$ and is calculated using only new data and for a posterior that is calculated using all observed data (old and new) with a prior of Gamma(9,6). The two models produce almost the same results as it can be seen on Figure 4. Additionally, means and variances for the two models are comparable as well as it is expected:

Measure	Model 1 (new data)	Model 2 (all observed data)
Mean	2.070024	0.1304974
Variance	2.06378	0.1294963

Comparison of JAGS models with new data only and all observed data

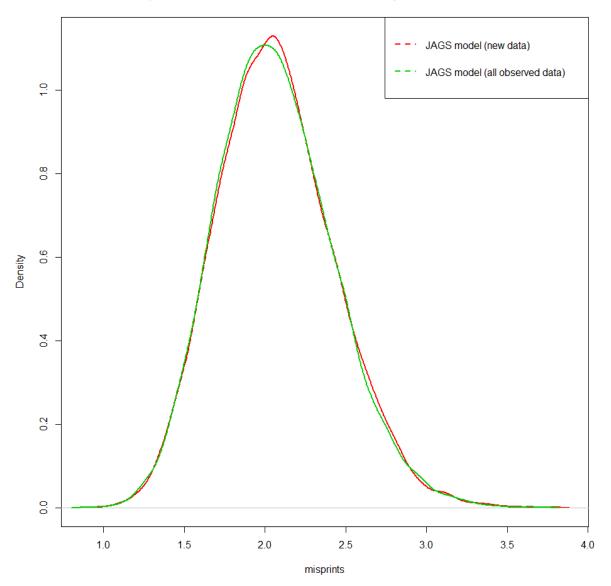


Figure 4. Comparison of JAGS models with new data only vs all observed data

Appendix

```
misprints1.model
model
{
    # the likelihood
    for(i in 1:N) {
        x[i] ~ dpois(lambda)
    }

    # the prior
    lambda ~ dgamma(alpha0, beta0)
}

misprints2.model
data { # create 3 identical datasets to use with 3 different priors
    for (j in 1:3) {
```

```
for(i in 1:N) {
     x2[i,j] \leftarrow x[i]
      \# x2[1,]=x2[2,]=x and just replicates the data for us
      }
    }
  }
mode1
  # Likelihood
  for(j in 1:3) { # loop over models
    for(i in 1:N) {
     x2[i,j] \sim dpois(lambda[j])
    }
  }
  # Priors
  lambda[1] ~ dgamma(alpha0, beta0)
  lambda[2] ~ dunif(a0, b0)
  lambda[3] ~ dgamma(alpha_jeffreys, beta_jeffreys) # need to use small value close to zero
as approximateion as using zero fails for calculation
}
misprints.R
library(rjags)
x_{misprints} = c(3, 4, 2, 1, 2, 3)
### Question 1 ###
#Data Section
misprints_data1 = list(N=6, x = x_misprints)
# hyperparameters (parameters for the priors)
alpha0 = 9
beta0 = 6
misprints_hypers1 = list(alpha0=alpha0, beta0=beta0)
# save in a single list
misprints1 = append(misprints data1, misprints hypers1)
jmodel1 = jags.model(file="misprints1.model", data=misprints1)
samps1 = jags.samples(jmodel1, "lambda", n.iter=10000)
title1 = paste("Comparison of JAGS model with Gamma(", alpha0, ",", beta0,
               ") prior and Theoretical posterior", sep="")
plot(density(samps1$lambda), col=3, lwd=2, xlab="misprints", main=title1)
# now compare to the theoretical results
alpha0 = 9
beta0 = 6
curve(dgamma(x, 24, 12), add=TRUE, col=2, lwd=2, lty=2) # theoretical posterior
legend("topright", c("JAGS posterior", "Theoretical posterior"), lty=c(1,2), col=c(3,2),
1wd=c(2,2))
cat("Mean of JAGS posterior: ", mean(samps1$lambda))
cat("Variance of JAGS posterior: ", var(samps1$lambda))
### Question 2 ###
misprints_data2 = list(N=6, x = x_misprints)
# hyperparameters (parameters for the priors)
a\theta = \theta
b0 = 10
alpha_jeffreys = 0.5
```

```
beta_jeffreys = 0.00001
misprints_hypers2 =
  list(alpha0=alpha0, beta0=beta0, a0=a0, b0=b0, alpha jeffreys = alpha jeffreys,
beta jeffreys = beta jeffreys)
# save in a single list
misprints2 = append(misprints data2, misprints hypers2)
jmodel2 = jags.model(file="misprints2.model", data=misprints2)
samps2 = jags.samples(jmodel2, "lambda", n.iter=10000)
# Comparison
xmin=min(samps2$lambda)
xmax=max(samps2$lambda)
title2 = paste("Comparison of JAGS models with Gamma(", alpha0, ",", beta0,
              "), Uniform(", a0, ",", b0,
              ") and Jeffrey's priors", sep="")
plot(density(samps2$lambda[1,,1]), col=2, lwd=2, xlab="misprints", main=title2,
xlim=c(xmin,xmax))
lines(density(samps2$lambda[2,,1]), col=3, lwd=2)
lines(density(samps2$lambda[3,,1]), col=4, lwd=2)
legend("topright",
       c(paste("JAGS models with Gamma(", alpha0, ",", beta0, ") prior", sep = ""),
paste("JAGS models with Uniform(", a0, ",", b0,") prior", sep = ""),
         paste("JAGS models with Gamma(", alpha_jeffreys, "
                                                          ',", beta_jeffreys, ") prior",
sep = "")),
       lty=c(1,1,1), col=c(2,3,4), lwd=c(2,2,2))
cat(paste("JAGS model with p(lambda)=Gamma(", alpha0, ",", beta0, ") mean / var = ",
sep=""),
mean(samps2$lambda[2,,1]), var(samps2$lambda[2,,1]), "\n")
cat(paste("JAGS model with p(lambda)=Gamma(", alpha_jeffreys, ",", beta_jeffreys, ") mean /
var = ", sep=""),
    mean(samps2\$lambda[3,,1]), var(samps2\$lambda[3,,1]), "\n")
curve(dunif(x, a0, b0), add=TRUE, col=2, lwd=2, lty=2) # Ubiform
curve(dgamma(x, alpha_jeffreys, beta_jeffreys), add=TRUE, col=3, lwd=2, lty=2) # Jeffreys
legend("topright",
       c(paste("Uniform(", a0, ",", b0,") prior", sep = ""),
  paste("Jeffreys' prior - Gamma(", alpha_jeffreys, ",", beta_jeffreys, ")", sep =
"")),
       lty=c(1,1), col=c(2,3), lwd=c(2,2))
### Question 3 ###
# New observations with posterior distrbution from Question 1 as a prior
x_newmisprints = c(2,1,6,0)
misprints_data3 = list(N=4, x = x_newmisprints)
# hyperparameters (parameters for the priors)
beta1 = mean(samps1$lambda) / var(samps1$lambda)
alpha1 = mean(samps1$lambda) * beta1
misprints_hypers3 = list(alpha0=alpha1, beta0=beta1)
# save in a single list
misprints3 = append(misprints_data3, misprints_hypers3)
jmodel3 = jags.model(file="misprints1.model", data=misprints3)
samps3 = jags.samples(jmodel3, "lambda", n.iter=10000)
# All observations with original Prior of Gamma(9,6)
misprints_data4 = list(N=10, x = c(x_misprints, x_newmisprints))
# hyperparameters (parameters for the priors)
misprints_hypers4 = list(alpha0=9, beta0=6)
```

```
# save in a single list
misprints4 = append(misprints_data4, misprints_hypers4)
jmodel4 = jags.model(file="misprints1.model", data=misprints4)
samps4 = jags.samples(jmodel4, "lambda", n.iter=10000)
# Comparison
title3 = "Comparison of JAGS models with new data only and all observed data"
plot(density(samps3$lambda), col=2, lwd=2, xlab="misprints", main=title3)
lines(density(samps4$lambda), col=3, lwd=2)
legend("topright", c("JAGS model (new data)", "JAGS model (all observed data)"),
lty=c(2,2), col=c(2,3), lwd=c(2,2))
cat(paste("JAGS model (new data) with p(lambda)=Gamma(", alpha1, ",", beta1, ") mean / var
= ", sep=""),
    mean(samps3$lambda), var(samps3$lambda), "\n")
cat(paste("JAGS model (all observed data) p(lambda)=Gamma(", alpha0, ",", beta0, ") mean /
var = ", sep=""),
    mean(samps4$lambda), var(samps4$lambda), "\n")
```