

Bayesian Learning

Lab 3

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Question 1

```
rainfall <- read.table("../data/rainfall.dat", header=F)
```

Prior

$$\begin{aligned}\mu &\sim N(\mu_0, \tau_0^2) \\ \sigma^2 &\sim \text{Inv-}\chi^2(\nu_0, \sigma_0^2)\end{aligned}$$

Likelihood

$$\mathbf{y}|\mu, \sigma^2 \sim N(\mu, \sigma^2)$$

Posterior

$$\begin{aligned}\mu|\sigma^2, \mathbf{x} &\sim N(\mu_n, \tau_n^2) \\ \sigma^2|\mu, \mathbf{x} &\sim \text{Inv-}\chi^2\left(\nu_n, \frac{\nu_0\sigma_0^2 + \sum_{i=1}^n (x_i - \mu)^2}{n + \nu_0}\right)\end{aligned}$$

where

$$\begin{aligned}\mu_n &= \frac{\frac{1}{\tau_0^2}}{\frac{1}{\tau_0^2} + \frac{n}{\sigma^2}} \mu_0 + \frac{\frac{n}{\sigma^2}}{\frac{1}{\tau_0^2} + \frac{n}{\sigma^2}} \bar{x} \\ \frac{1}{\tau_n^2} &= \frac{1}{\tau_0^2} + \frac{n}{\sigma^2} \\ \nu_n &= \nu_0 + n\end{aligned}$$

a)

```
library(geoR)

mun <- function(x, sigmasq, hyperparams){
  n <- length(x)
  denom <- ((1 / hyperparams$tausq0) + (n / sigmasq))
```

```

    pt1 <- ((1 / hyperparams$tausq0) / denom) * hyperparams$mu0
    pt2 <- ((n / sigmasq) / denom) * mean(x)

    pt1 + pt2
}

taun <- function(x, sigmasq, hyperparams){
  hyperparams$tausq0 + (sigmasq / length(x))
  1/ hyperparams$tausq0
}

nun <- function(x, hyperparams){
  hyperparams$nu0 + length(x)
}

sigmasqn <- function(x, mu, hyperparams){
  (hyperparams$nu0 * hyperparams$sigmasq0 + sum((x - mu)^2 )) / (length(x) + hyperparams$nu0)
}

musampler <- function(x,sigmasq, hyperparams){
  mu <- mun(x, sigmasq, hyperparams)
  sigma <- sqrt(taun(x,sigmasq, hyperparams))
  rnorm(1, mu, sigma)
}

sigmasampler <- function(x, mu, hyperparams){
  scale <- sigmasqn(x, mu, hyperparams)
  df <- nun(x, hyperparams)
  rinvcchisq(1, df, scale)
}

```

Now we start sampling

```

gibbs <- function(x, iter, init, hyperparams){
  samples <- matrix(NA, ncol = 2, nrow = iter + 1)
  samples[1,] <- init

  for (i in 2:(iter+1)){
    mu <- musampler(x, samples[i-1, 2], hyperparams)
    sigma <- sigmasampler(x, mu, hyperparams)
    samples[i,] <- c(mu, sigma)
  }

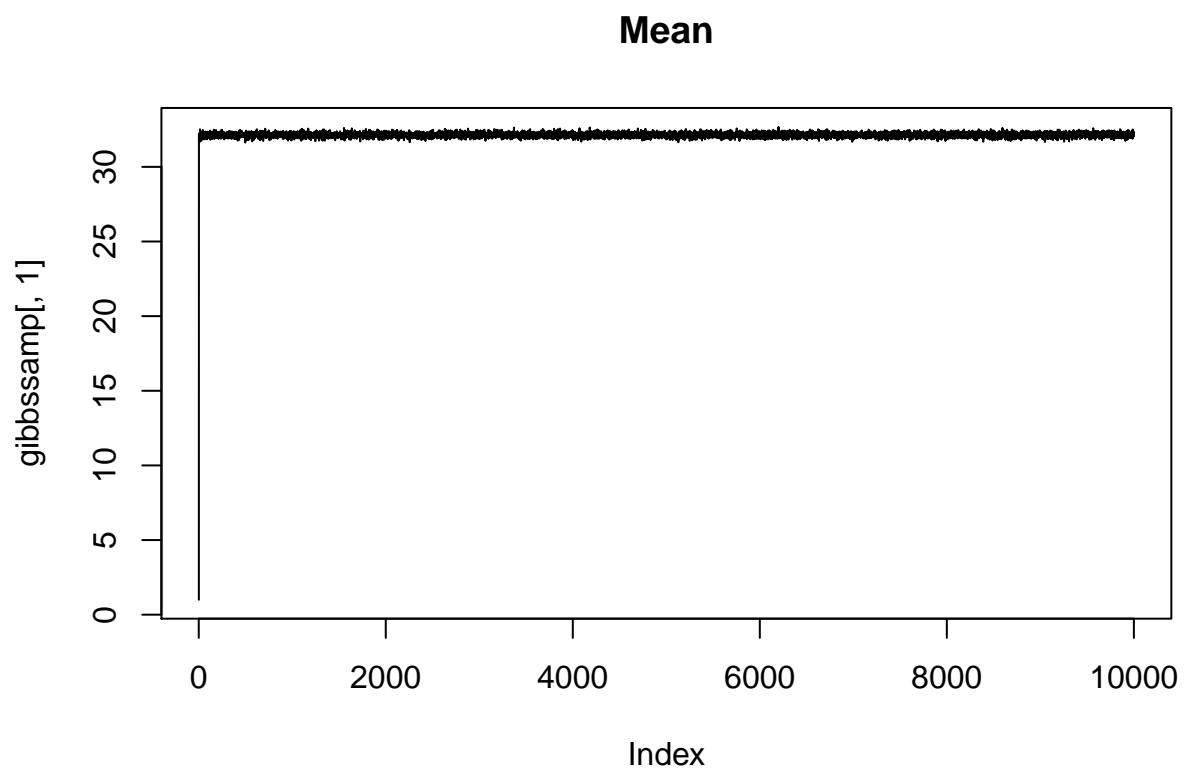
  samples
}

hyperparams <- list(mu0=0, tausq0=50, nu0=1, sigmasq0=50)

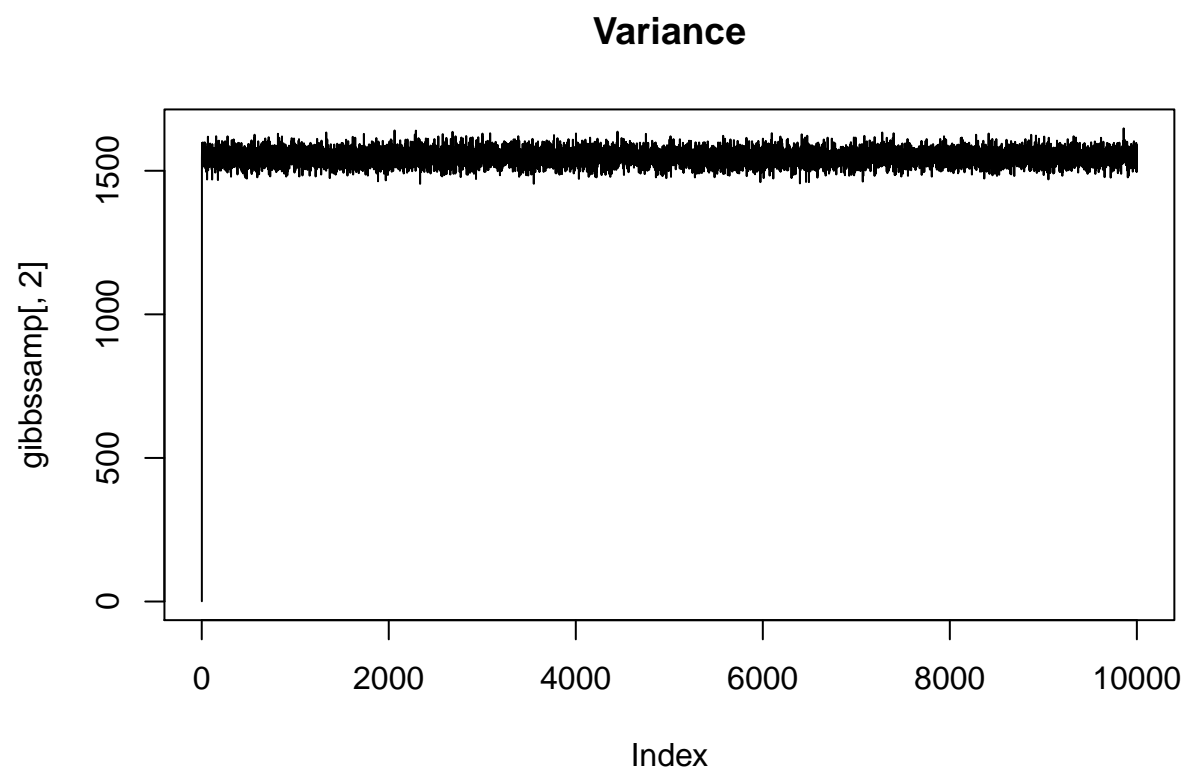
gibbsamp <- gibbs(x=rainfall$V1, iter = 10000, init = c(1,1), hyperparams)

```

```
plot(gibbssamp[,1], type = "l", main="Mean")
```



```
plot(gibbssamp[,2], type = "l", main="Variance")
```



b)

c)

Question 2

a)

b)

c)