

1. I chose a prior of  $(\theta_h, \theta_w) = (50, 50)$ .

Make  $\mu - 2\sigma = 0$ , where we can have a 95% confidence interval within 2 variance, we know  $\sigma_1 = \sigma_2 = 25$ .

Assuming the correlation between husband and wife age is 0.5, then  $\sigma_{12} = \sigma_{21} = 25 * 25 * 0.5 = 312.5$

Thus we have  $\Lambda_0 = \begin{bmatrix} 625 & 312.5 \\ 312.5 & 625 \end{bmatrix}$

2. The prior predictive distribution under such prior assumptions is as following

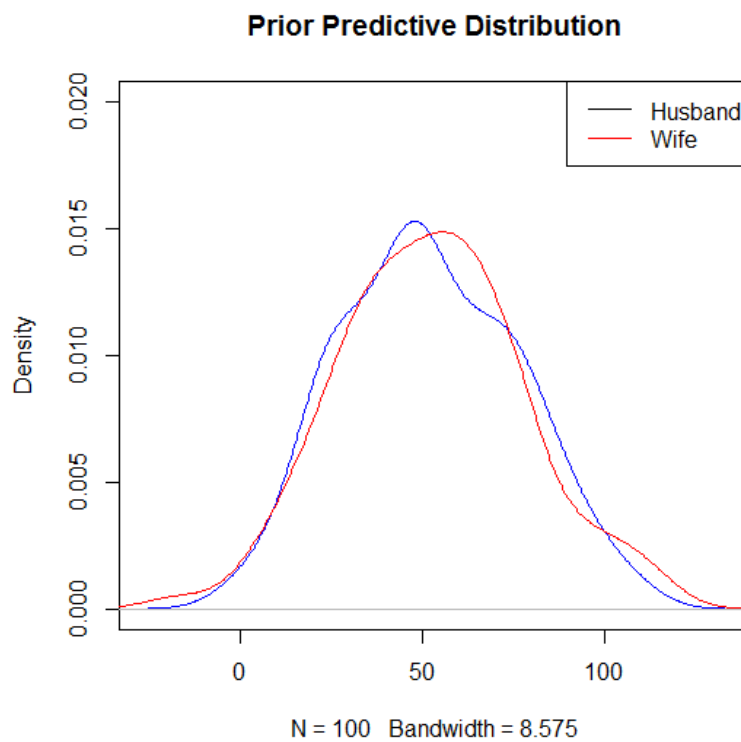
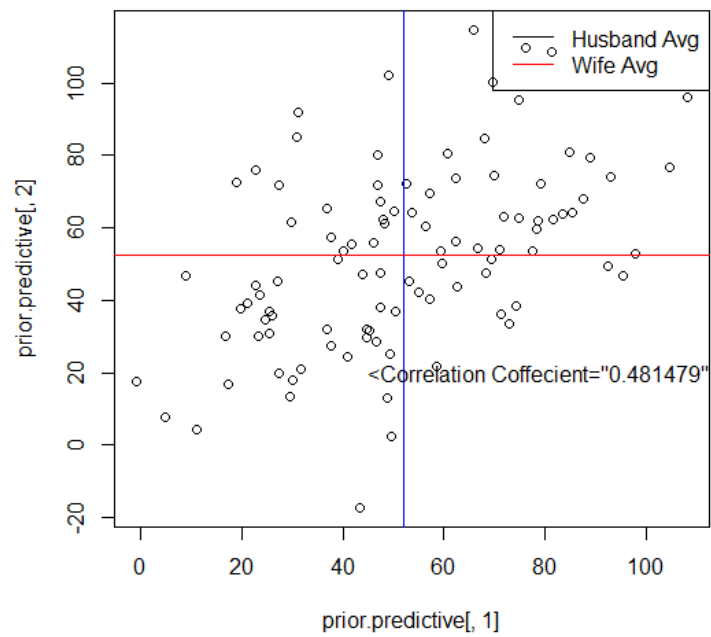
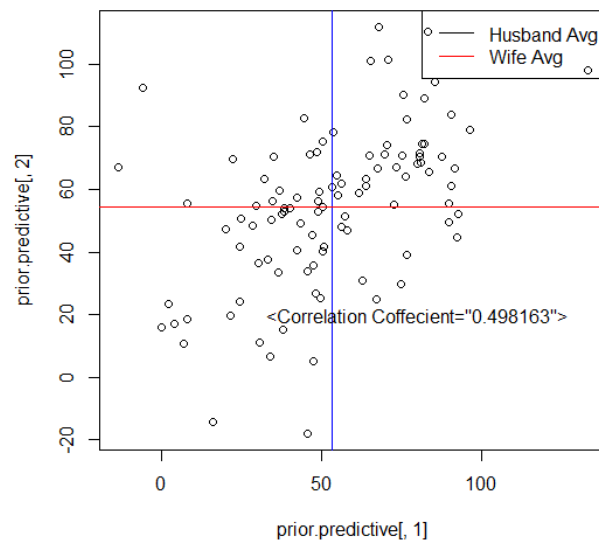


Figure 1: Prior Predictive Distribution Test Plot 1, under prior assumption stated in Q1

Figure 2: Scatter Plot of  $\theta_h$ ,  $\theta_w$  in Prior Predictive Distribution, example 1Figure 3: Scatter Plot of  $\theta_h$ ,  $\theta_w$  in Prior Predictive Distribution, example 2

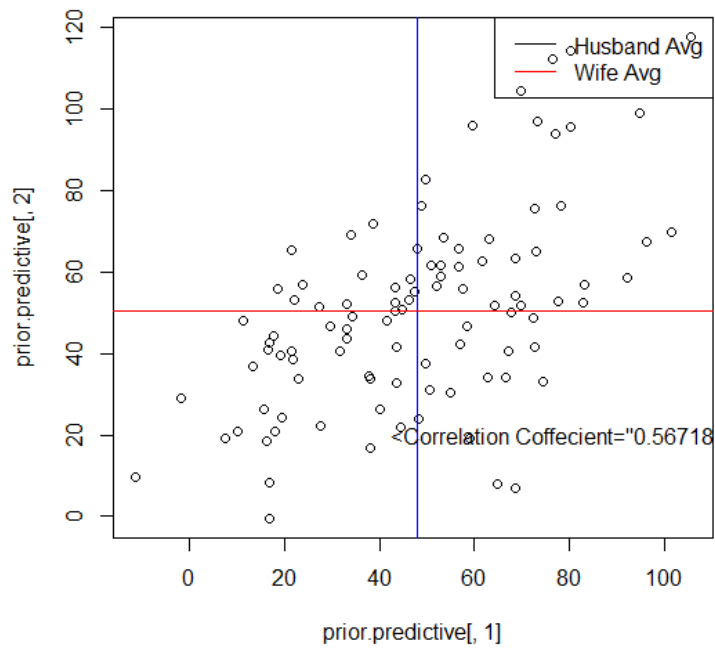


Figure 4: Scatter Plot of  $\theta_h$ ,  $\theta_w$  in Prior Predictive Distribution, example 3

From the above three figures, we can see, our prior If your prior predictive datasets does generally conform to your beliefs of the parameters.

3. Following the method in Hoff book page 112-113, which is also stated in Lab lectures, we can do the Gibbs sampling, upon a prior stated in question 1.

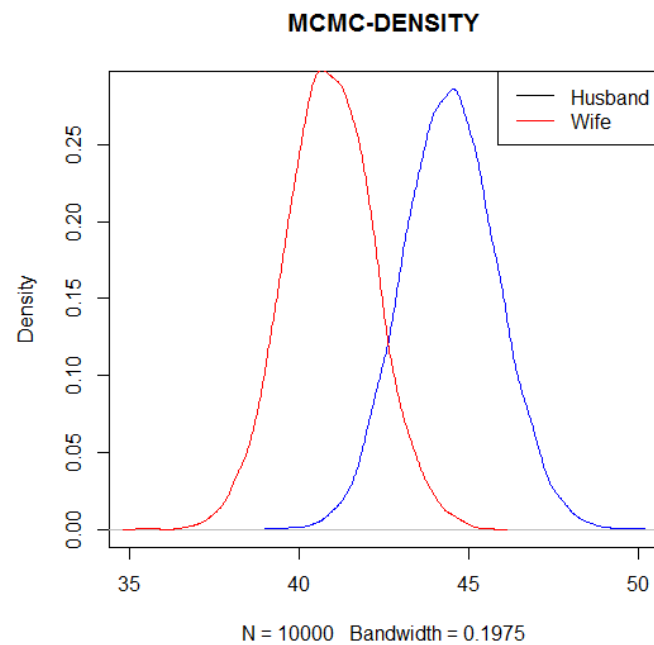


Figure 5: Density Distribution of  $\theta_h$  and  $\theta_w$  in MCMC simulation

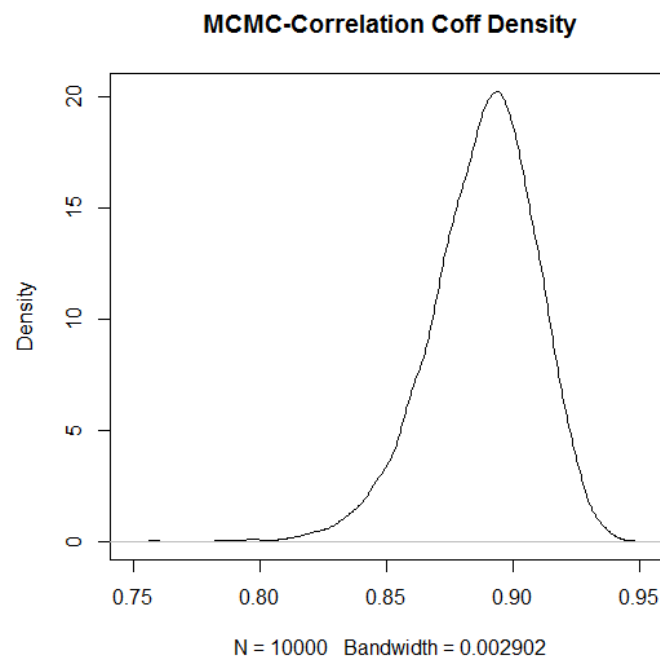


Figure 6: Density Distribution of Correlation Coefficient in MCMC simulation

95% Intervals are:

**Husband  $\theta_h$  =(41.81863 47.16969)**

**Wife  $\theta_w$  =(38.34298 43.51096).**

**Correlation Coefficient= (0.8421991 0.9240957)**

4. Using the new prior, we can calculate the new distribution. The 95% Interval are:

**Husband  $\theta_h$  =( 41.70611 47.20329)**

**Wife  $\theta_w$  =( 38.36744 43.53102)**

**Correlation Coefficient= (0.7947551 0.8999829)**

**We can see, the actually result under very different prior is actually very close, especially for  $\theta_h$ ,  $\theta_w$ , but correlation coefficient is biased.**

5. The probability that  $\text{pr}(\theta_h > \theta_w) = 1$ , when using the given data set.

**Please also refer to the code attached.**

CODE:

```
#####2#####
```

```
library(mvtnorm)
age<-read.table(header = TRUE,"http://www.stat.washington.edu/hoff/Book/Data/hwdata/agehw.dat")

mu0<-c(45,40)
L0<-matrix(c(625,312.5,312.5,625),2,2)

nu0<-4
S0<-matrix(c(625,312.5,312.5,625),2,2)

prior.predictive<-matrix(nrow=100,ncol=2)
for (i in 1:100) {
  theta.star<-rmvnorm(100,mu0,L0)
  prior.predictive[i,<-rmvnorm(1,colMeans(theta.star),cov(theta.star))
}

#plot(density(prior.predictive[,1]),col="blue",main="Prior Predictive Distribution",ylim=c(0,0.02))
#lines(density(prior.predictive[,2]),col="red")
#legend("topright", legend=c("Husband","Wife"), col=c(1,2), lty=1)
```

```

plot(prior.predictive[, 1], prior.predictive[, 2])
cov(prior.predictive)
abline(v=colMeans(prior.predictive)[1],col='blue')
abline(h=colMeans(prior.predictive)[2],col='red')

legend("topright", legend=c("Husband Avg","Wife Avg"), col=c(1,2), lty=1)

cof=cov(prior.predictive)[1,2]/(sqrt(var(prior.predictive[,1]))*sqrt(var(prior.predictive[,2])))
print(cof)
text(80,20, sprintf("<Correlation Coffecient=\"%f\">",cof))

```

```
#####3#####3
```

```

n<-dim(age)[1]
ybar<-apply(age,2,mean)
Sigma<-cov(age)
THETA<-SIGMA<-NULL

for (s in 1:10000)
{
  Ln<-solve(solve(L0)+n*solve(Sigma))
  mun<-Ln*%(solve(L0)*%mu0+n*solve(Sigma)*%ybar)
  theta<-rmvnorm(1,mun,Ln)

  Sn<-S0+(t(age)-c(theta))*%t(t(age)-c(theta))
  Sigma<-solve(rwish(1,nu0+n,solve(Sn)))

  THETA<-rbind(THETA,theta)
  SIGMA<-rbind(SIGMA,c(Sigma))
}
plot(density(THETA[,1]),col="blue",main="MCMC-DENSITY",xlim=c(35,50))
lines(density(THETA[,2]),col="red")
legend("topright", legend=c("Husband","Wife"), col=c(1,2), lty=1)
quantile(THETA[,1],c(0.025,0.975))
quantile(THETA[,2],c(0.025,0.975))

####Correlation Coffecient
Coff=SIGMA[,2]/sqrt(SIGMA[,1]*SIGMA[,4])
plot(density(Coff),main="MCMC-Correlation Coff Density")
quantile(Coff,c(0.025,0.975))

```

```
#####4#####
```

```

library(mvtnorm)
age<-read.table(header = TRUE,"http://www.stat.washington.edu/hoff/Book/Data/hwdata/agehw.dat")

```

```

mu0<-c(0,0)
L0<-matrix(c(10^5,0,0,10^5),2,2)

nu0<-3
S0<-matrix(c(1000,0,0,1000),2,2)

n<-dim(age)[1]
ybar<-apply(age,2,mean)
Sigma<-cov(age)
THETA<-SIGMA<-NULL

for (s in 1:10000)
{
  Ln<-solve(solve(L0)+n*solve(Sigma))
  mun<-Ln%*(solve(L0)%*mu0+n*solve(Sigma)%*ybar)
  theta<-rmvnorm(1,mun,Ln)

  Sn<-S0+(t(age)-c(theta))%*t(t(age)-c(theta))
  Sigma<-solve(rwish(1,nu0+n,solve(Sn)))

  THETA<-rbind(THETA,theta)
  SIGMA<-rbind(SIGMA,c(Sigma))
}
plot(density(THETA[,1]),col="blue",main="MCMC-DENSITY",xlim=c(35,50))
lines(density(THETA[,2]),col="red")
legend("topright", legend=c("Husband","Wife"), col=c(1,2), lty=1)
quantile(THETA[,1],c(0.025,0.975))
quantile(THETA[,2],c(0.025,0.975))

####Correlation Coefficient
Coff=SIGMA[,2]/sqrt(SIGMA[,1]*SIGMA[,4])
plot(density(Coff),main="MCMC-Correlation Coff Density")
quantile(Coff,c(0.025,0.975))

#####5#####
mean(THETA[,1]>THETA[,2])

```