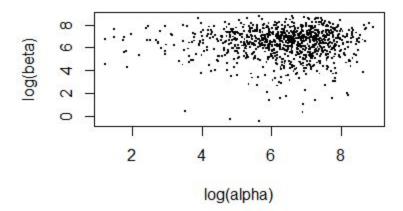
#### Answer 1:

## a)

## i)R-code

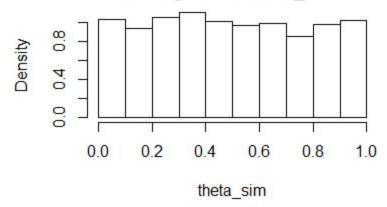
alpha <- rexp(1000,.001) beta <- rexp(1000,.001) plot(log(alpha),log(beta),pch=".",cex=2)



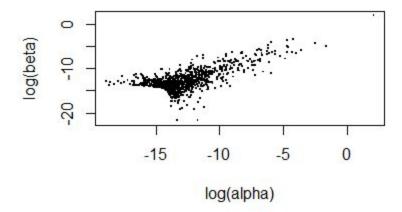
## ii) R-code

theta\_sim = rbeta(1000,alpha,beta) hist(theta\_sim,freq = FALSE)

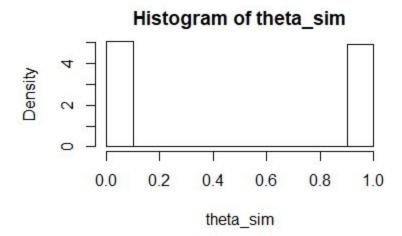
## Histogram of theta\_sim



b)
i) phi1 <- runif(1000,0,1)
phi2 <- runif(1000,0,1000)
alpha <- phi1/(phi2^2)
beta <- (1-phi1)/(phi2^2)
plot(log(alpha),log(beta),pch=".",cex=2)



ii)
theta\_sim = rbeta(1000,alpha,beta)
hist(theta\_sim, freq = FALSE)



•

#### Answer 2:

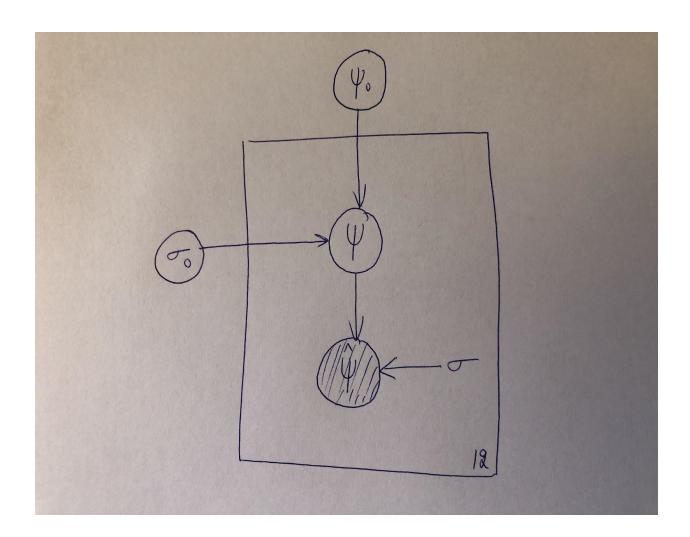
a)

i)  $\sigma 0$  and  $\psi 0$  are hyperparameters

 $\sigma 0$ : intended to approximate a uniform distribution on  $(0, \infty)$ 

 $\psi \mathbf{0}$  : intended to approximate a diffuse  $% \mathbf{0}$  normal distribution with mean 0 and  $% \mathbf{0}$  infinite variance

## b) DAG



#### c) R setup code:

```
#Read and format data for JAGS model
df <- read.csv("numbers.txt",sep = "",header = FALSE)</pre>
df <- df[2:3]
names(df) <- c("psihat","sigma")</pre>
#Run jags model and set the seed for reproducibility
library(rjags)
m <- jags.model("asgn2template.bug", df,inits = list(.RNG.name = "base::Wichmann-Hill",
.RNG.seed = 1989))
Jags model (asgn2template.bug):
model {
 for (j in 1:length(psihat)) {
  psihat[j] ~ dnorm(psi[j],1/sigma[j]^2)
  psi[j] ~ dnorm(psi0,1/sigmasq0)
 }
 psi0 \sim dnorm(0,1000^{2})
 sigma0 \sim dunif(0,1000)
 sigmasq0 <- sigma0^2
d) #Burn in 10000 iterations
update(m,10000)
# Run the model for 100,000 iterations
x <- coda.samples(m, c("psi0","sigmasq0"), n.iter=100000)
summary(x)
1. Empirical mean and standard deviation for each variable,
 plus standard error of the mean:
        Mean SD Naive SE Time-series SE
psi0 1.661e-05 0.001 3.163e-06
                                     3.203e-06
sigmasq0 1.689e-01 0.145 4.586e-04 1.106e-03
```

2. Quantiles for each variable:

```
2.5% 25% 50% 75% 97.5% psi0 -0.00195 -0.0006553 1.626e-05 0.0006943 0.001978 sigmasq0 0.01899 0.0776716 1.319e-01 0.2147620 0.534149
```

#### Posterior mean

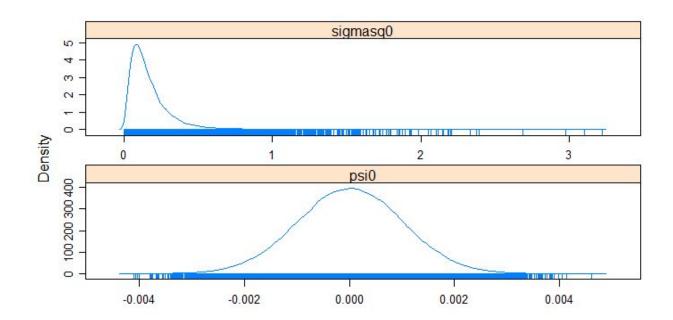
 $E(psi0|psihat) = \frac{1.661e-05}{E(sigmasq0|psihat)} = \frac{1.689e-01}{1.689e-01}$ 

#### **Posterior SD**

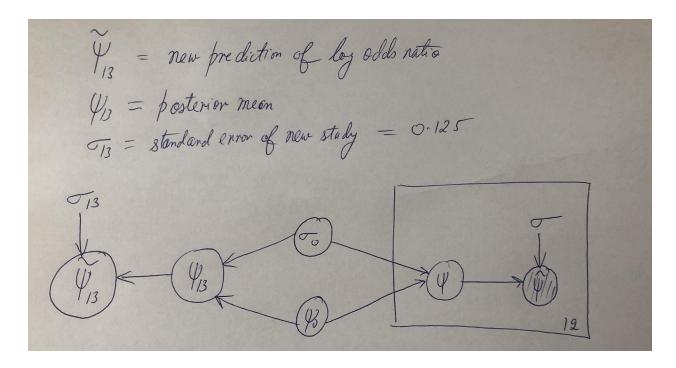
Posterior standard deviation of psi0 = 0.001
Posterior standard deviation of sigmasq0 = 0.145

#### 95% central posterior interval

psi0 = (-0.00195, 0.001978)sigmasq0 = (0.01899, 0.534149)



#### i)DAG for new prediction



li)

#### R setup code:

#### #Read and format data for JAGS model

df <- read.csv("numbers.txt",sep = "",header = FALSE)
df <- df[2:3]
names(df) <- c("psihat","sigma")</pre>

#### ##Run jags model and set the seed for reproducibility

library(rjags)

m <- jags.model("asgn2template1.bug", c(as.list(df), sigma.13 =.125),inits = list(.RNG.name = "base::Wichmann-Hill", .RNG.seed = 1989))

#### #Burn in 10000 iterations

update(m,10000)

# # Run the model for 100,000 iterations and save the stats for prediction and indicator variable

x <- coda.samples(m, c("psi.tilde.13","ind"), n.iter=100000)

#### **JAGS** model

```
model {
 for (i in 1:length(psihat)) {
  psihat[j] ~ dnorm(psi[j],1/sigma[j]^2)
  psi[j] ~ dnorm(psi0,1/sigmasq0)
 }
 psi0 \sim dnorm(0,1000^{2})
 sigma0 \sim dunif(0,1000)
 sigmasq0 <- sigma0^2
 psi.tilde.13 ~ dnorm(psi.13, 1/sigma.13^2)
 psi.13 ~ dnorm(psi0, 1/sigma0^2)
 ind <- psi.tilde.13 >2*sigma.13
}
iii)
Summary(x)
Iterations = 11001:111000
Thinning interval = 1
Number of chains = 1
Sample size per chain = 1e+05
```

1. Empirical mean and standard deviation for each variable, plus standard error of the mean:

```
Mean SD Naive SE Time-series SE ind 0.2480400 0.4319 0.001366 0.001547 psi.tilde.13 -0.0008291 0.4276 0.001352 0.001352
```

2. Quantiles for each variable:

```
2.5% 25% 50% 75% 97.5% ind 0.0000 0.0000 0.000000 0.0000 1.0000 psi.tilde.13 -0.8754 -0.2471 0.0007902 0.2477 0.8646
```

```
Posterior mean of psi.tilde.13 = -0.0008291
Posterior SD of psi.tilde.13 = 0.4276
95% posterior central interval of psi.tilde.13 = (-0.8754, 0.8646)
```

iv)

1. Empirical mean and standard deviation for each variable, plus standard error of the mean:

Mean SD Naive SE Time-series SE ind 0.2480400 0.4319 0.001366 0.001547

Mean of indicator variable is the posterior probability that the predicted log odds ratio is greater than twice its standard error (i.e. will find statistically significant result) = 0.2480400