

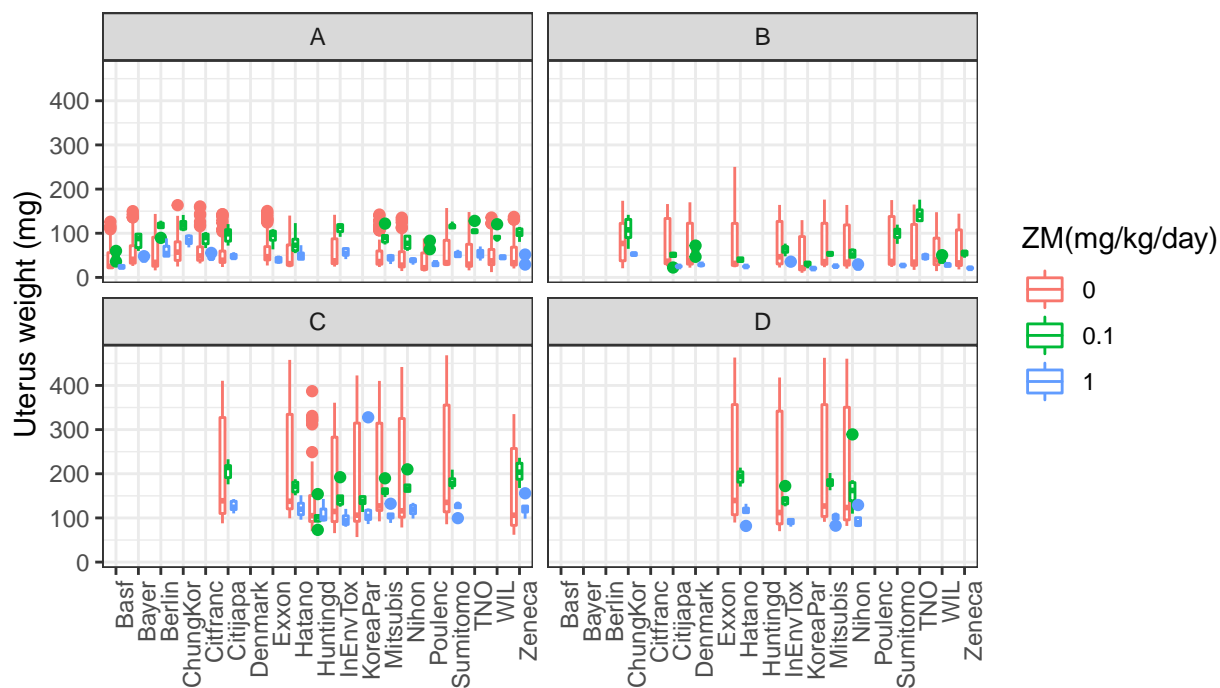
# STA721 Final Project

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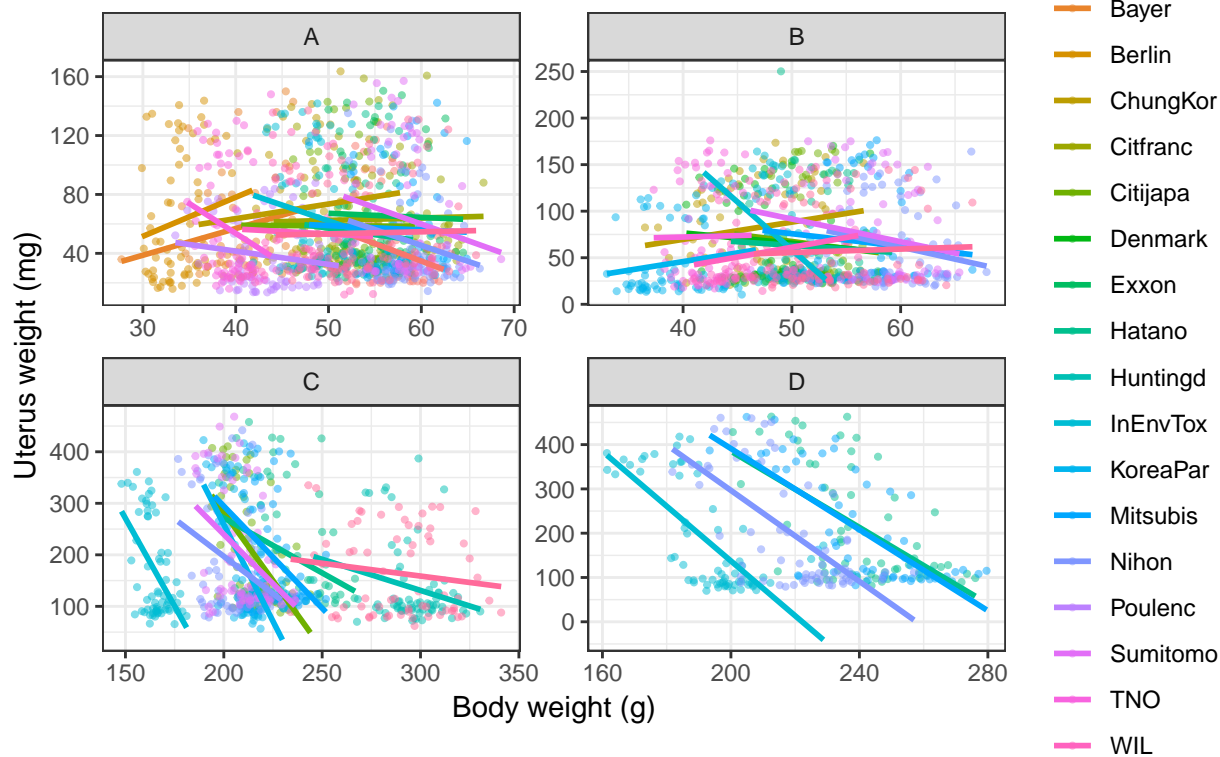
*12/8/2018*

- 1. Summary**
- 2. Introductions**
- 3. Model And Result**
- 4. Conclusion**

The side-by-side boxplot of uterus weight to estrogen antagonist(ZM), facet by protocol



The side-by-side scatterplots of Uterus weight to Body weight (g), facet by protocol



## Apeendix

### EDA

```
bioassay_lm = bioassay[, -7]
str(bioassay_lm)
```

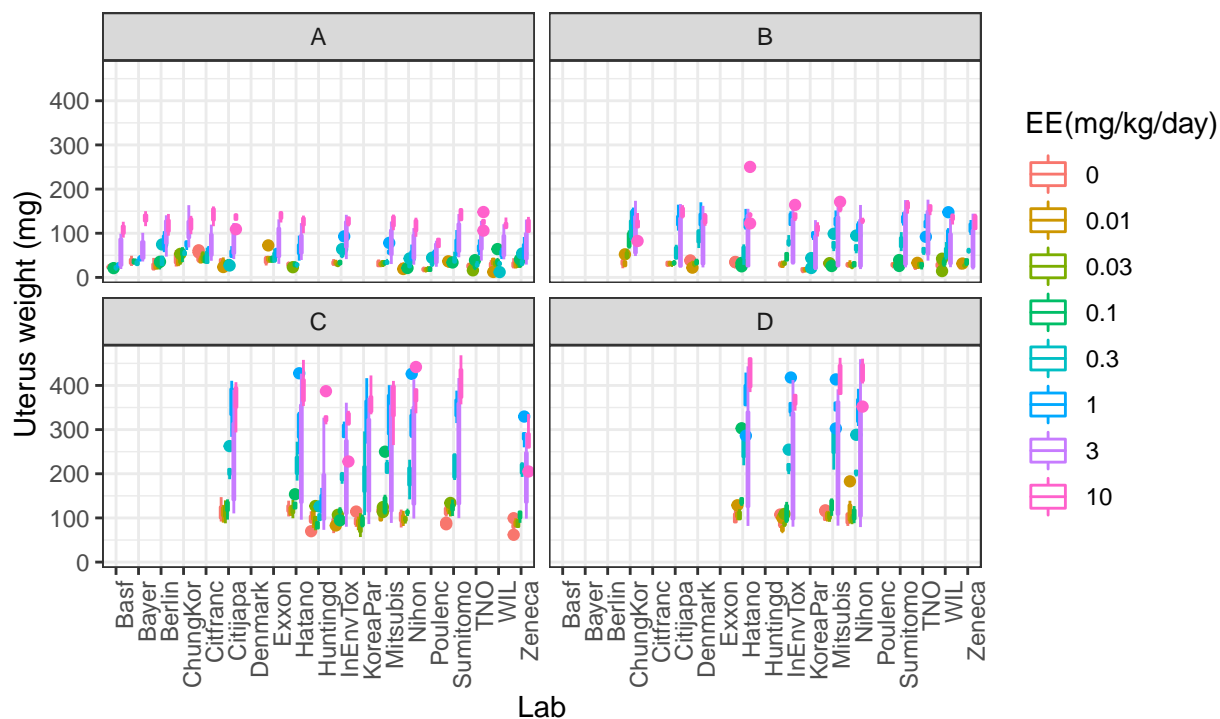
```
## 'data.frame': 2677 obs. of 6 variables:
## $ uterus : num 21 22 21 26 24 25 22 26 24 22 ...
## $ weight : num 61.9 55.9 59.1 54.8 57.5 57.6 60.3 59 59.1 61.4 ...
## $ protocol: Factor w/ 4 levels "A","B","C","D": 1 1 1 1 1 1 1 1 1 1 ...
## $ EE : Factor w/ 8 levels "0","0.01","0.03",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ ZM : Factor w/ 3 levels "0","0.1","1": 1 1 1 1 1 1 1 1 1 1 ...
## $ lab : Factor w/ 19 levels "BASF","Bayer",...: 1 1 1 1 1 1 1 1 1 1 ...
```

```
table(bioassay_lm$EE, bioassay_lm$ZM)
```

```
##
##      0 0.1 1
## 0    484 0 0
## 0.01 234 0 0
## 0.03 239 0 0
## 0.1  246 0 0
## 0.3  246 0 0
## 1    246 0 0
## 3    246 245 246
## 10   245 0 0
```

```
ggplot(data=bioassay, mapping = aes(y = uterus, x = lab, color=EE)) +
  geom_boxplot() + theme_bw() + facet_wrap(~ protocol) +
  theme(axis.text.x = element_text(angle = 90, hjust = 1)) +
  labs(x = "Lab", y = "Uterus weight (mg)", title = "The side-by-side boxplot of uterus weight for different
different dose of estrogen agonist (EE), facet by protocol", caption = "", colour = "EE(mg/kg/day)")
```

The side-by-side boxplot of uterus weight for different labs and different dose of estrogen agonist(EE), facet by protocol



## Model Part I

```
lm1 = lm(uterus~., data = bioassay_lm)
summary(lm1)
```

```
##
## Call:
## lm(formula = uterus ~ ., data = bioassay_lm)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -107.625  -30.150   2.595   21.979  190.872
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   15.82251     6.55993   2.412 0.015933 *
## weight       -0.45365     0.05508  -8.237 2.75e-16 ***
## protocolB      7.84315     2.26416   3.464 0.000541 ***
## protocolC    207.53588     9.48173  21.888 < 2e-16 ***
## protocolD    221.22623    10.07610  21.956 < 2e-16 ***
## EE0.01       -0.60177     3.31535  -0.182 0.855982
## EE0.03        0.26008     3.28953   0.079 0.936989
## EE0.1         8.01257     3.25677   2.460 0.013946 *
## EE0.3        47.94479     3.25716  14.720 < 2e-16 ***
## EE1         106.35605     3.26542  32.570 < 2e-16 ***
## EE3         136.45891     3.27333  41.688 < 2e-16 ***
## EE10        150.55730     3.28955  45.768 < 2e-16 ***
```

```
## ZM0.1      -80.51563    3.75770 -21.427 < 2e-16 ***
## ZM1       -127.18576    3.75162 -33.902 < 2e-16 ***
## labBayer    2.60266    7.88343  0.330 0.741318
## labBerlin  14.84134    7.55929  1.963 0.049713 *
## labChungKor 32.46041    6.63073  4.895 1.04e-06 ***
## labCitfranc 26.21060    7.45111  3.518 0.000443 ***
## labCitijapa 21.52689    6.33273  3.399 0.000686 ***
## labDenmark  18.95727    7.80137  2.430 0.015165 *
## labExxon   23.72114    7.62673  3.110 0.001889 **
## labHatano   26.83352    6.19974  4.328 1.56e-05 ***
## labHuntingd 0.09856    8.84741  0.011 0.991112
## labInEnvTox 0.58445    6.38094  0.092 0.927028
## labKoreaPar -2.51500    6.88744 -0.365 0.715023
## labMitsubis 24.63683    6.19749  3.975 7.22e-05 ***
## labNihon    13.18893    6.20345  2.126 0.033590 *
## labPoulenc  -4.14169    7.49225 -0.553 0.580450
## labSumitomo 28.52520    6.32781  4.508 6.83e-06 ***
## labTNO      16.56429    6.68045  2.480 0.013218 *
## labWIL      10.05022    6.63237  1.515 0.129809
## labZeneca   17.93047    6.42998  2.789 0.005332 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 41.56 on 2645 degrees of freedom
## Multiple R-squared:  0.802, Adjusted R-squared:  0.7997
## F-statistic: 345.7 on 31 and 2645 DF, p-value: < 2.2e-16
```

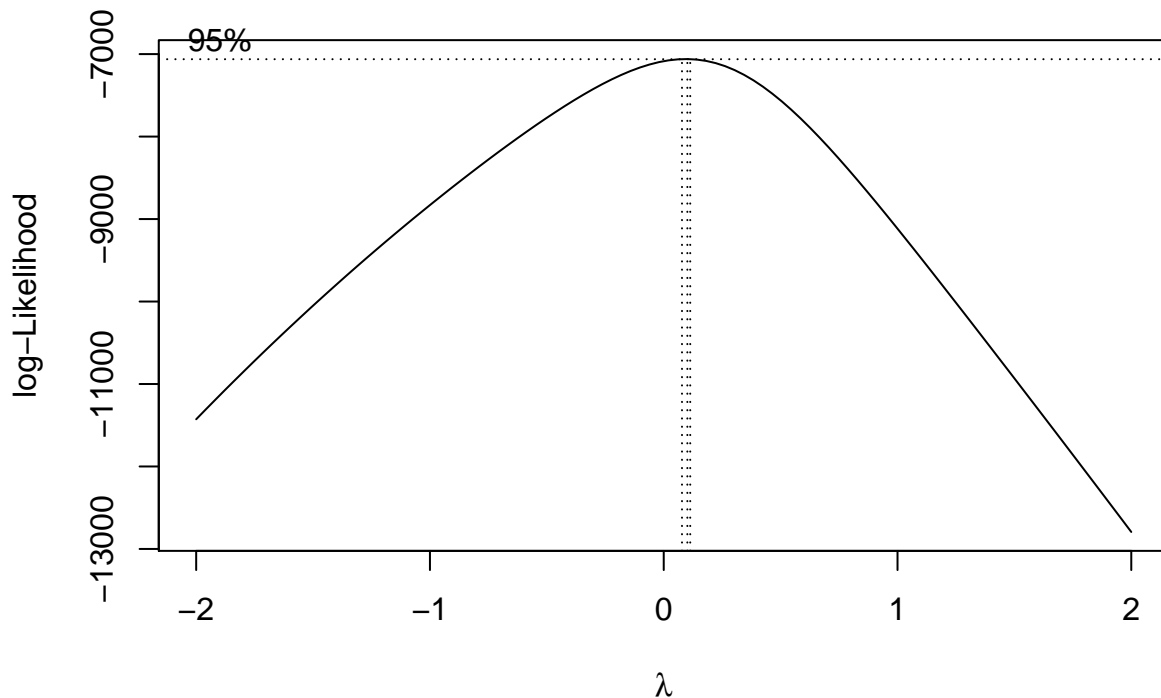
```
step(lm1, k=log(2677))
```

```
## Start:  AIC=20175.57
## uterus ~ weight + protocol + EE + ZM + lab
##
##           Df Sum of Sq      RSS   AIC
## <none>                 4568714 20176
## - lab       18   304839  4873553 20206
## - weight    1   117187  4685901 20236
## - protocol  3    855660  5424374 20612
## - ZM        2   2030817  6599531 21144
## - EE        7   7683826 12252540 22761
##
## Call:
## lm(formula = uterus ~ weight + protocol + EE + ZM + lab, data = bioassay_lm)
##
## Coefficients:
## (Intercept)      weight  protocolB  protocolC  protocolD
##    15.82251    -0.45365     7.84315    207.53588    221.22623
##      EE0.01      EE0.03      EE0.1      EE0.3      EE1
##   -0.60177     0.26008     8.01257    47.94479   106.35605
##      EE3      EE10      ZM0.1      ZM1      labBayer
##  136.45891   150.55730   -80.51563  -127.18576     2.60266
## labBerlin labChungKor labCitfranc labCitijapa labDenmark
##   14.84134    32.46041    26.21060    21.52689    18.95727
##   labExxon labHatano labHuntingd labInEnvTox labKoreaPar
##   23.72114    26.83352     0.09856     0.58445    -2.51500
```

```
## labMitsubis    labNihon    labPoulenc    labSumitomo    labTNO
##      24.63683     13.18893     -4.14169     28.52520     16.56429
##      labWIL     labZeneca
##      10.05022     17.93047
```

```
library(MASS)
```

```
##
## Attaching package: 'MASS'
## The following object is masked from 'package:dplyr':
##
##      select
box =boxcox(lm1)
```



```
lm2 = lm(formula = log(uterus) ~ log(weight) + protocol + EE + ZM + lab, data = bioassay_lm)
summary(lm2)
```

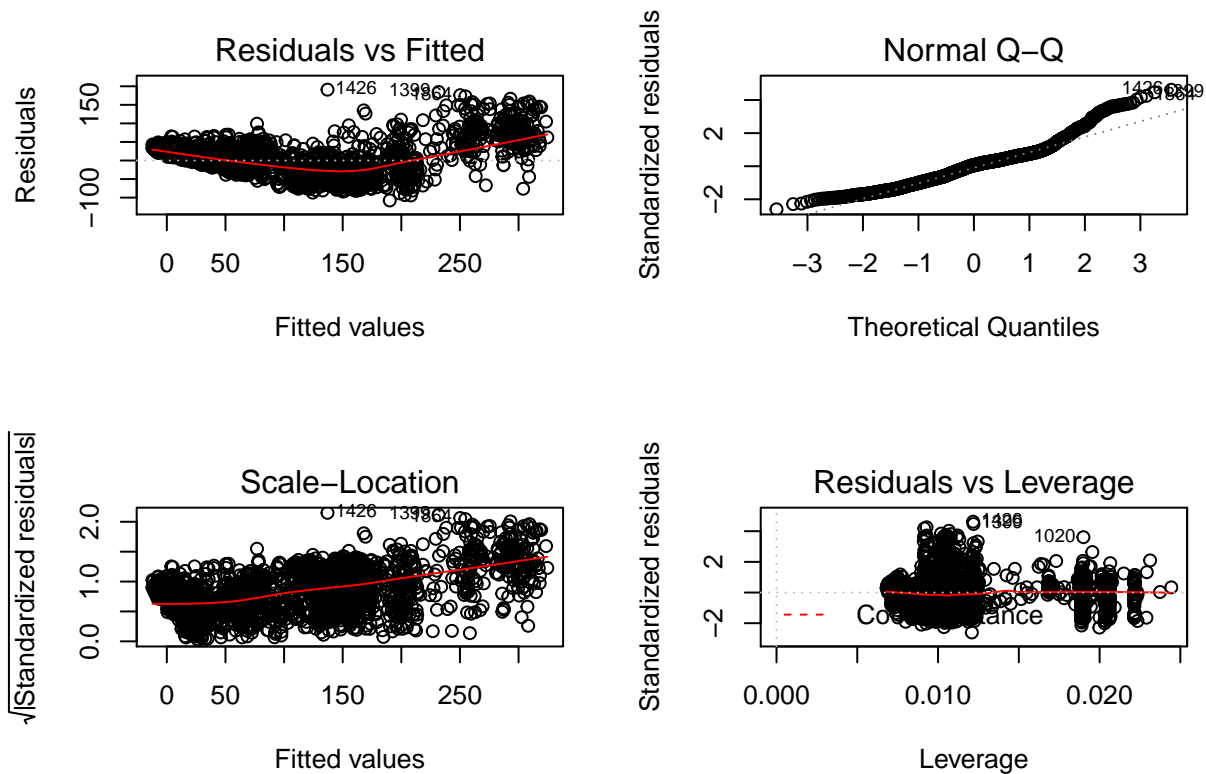
```
##
## Call:
## lm(formula = log(uterus) ~ log(weight) + protocol + EE + ZM +
##      lab, data = bioassay_lm)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -1.38682 -0.16223  0.01173  0.16583  1.21149
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   1.321144   0.239602   5.514 3.85e-08 ***
## log(weight)    0.410375   0.058372   7.030 2.61e-12 ***
## protocolB      0.055004   0.014890   3.694 0.000225 ***
## protocolC      0.689389   0.083618   8.244 2.58e-16 ***
```

```

## protocolD      0.675012    0.085999    7.849 6.03e-15 ***
## EE0.01         0.002747    0.021776    0.126 0.899614
## EE0.03         0.012017    0.021606    0.556 0.578144
## EE0.1          0.131728    0.021388    6.159 8.44e-10 ***
## EE0.3          0.551201    0.021396   25.762 < 2e-16 ***
## EE1            1.061739    0.021438   49.527 < 2e-16 ***
## EE3            1.352063    0.021477   62.954 < 2e-16 ***
## EE10           1.451617    0.021571   67.294 < 2e-16 ***
## ZM0.1          -0.531428    0.024670  -21.541 < 2e-16 ***
## ZM1            -1.145005    0.024622  -46.504 < 2e-16 ***
## labBayer       0.457789    0.055245    8.286 < 2e-16 ***
## labBerlin      0.610866    0.057515   10.621 < 2e-16 ***
## labChungKor    0.762522    0.044567   17.109 < 2e-16 ***
## labCitfranc    0.559241    0.048950   11.425 < 2e-16 ***
## labCitijapa    0.445367    0.041829   10.647 < 2e-16 ***
## labDenmark     0.506016    0.051920    9.746 < 2e-16 ***
## labExxon       0.517897    0.050097   10.338 < 2e-16 ***
## labHatano      0.383445    0.040728    9.415 < 2e-16 ***
## labHuntingd   -0.053061    0.053724   -0.988 0.323416
## labInEnvTox    0.455932    0.042501   10.728 < 2e-16 ***
## labKoreaPar    0.178793    0.046846    3.817 0.000138 ***
## labMitsubis    0.392970    0.040688    9.658 < 2e-16 ***
## labNihon       0.307153    0.040710    7.545 6.19e-14 ***
## labPoulenc     0.097765    0.051708    1.891 0.058768 .
## labSumitomo    0.464850    0.041551   11.187 < 2e-16 ***
## labTNO         0.533952    0.047525   11.235 < 2e-16 ***
## labWIL         0.380265    0.044646    8.517 < 2e-16 ***
## labZeneca      0.251125    0.041670    6.027 1.91e-09 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.273 on 2645 degrees of freedom
## Multiple R-squared:  0.8937, Adjusted R-squared:  0.8925
## F-statistic: 717.6 on 31 and 2645 DF,  p-value: < 2.2e-16

par(mfrow=c(2,2))
plot(lm1)

```



Frequentist Random Effect Model:

```
library(lme4)

## Loading required package: Matrix
##
## Attaching package: 'Matrix'
## The following object is masked from 'package:tidyr':
##
##   expand
randonmeffect = lmer(log(uterus) ~ log(weight) + protocol + EE + ZM + (1+EE+ZM|lab), data = bioassay_lm)

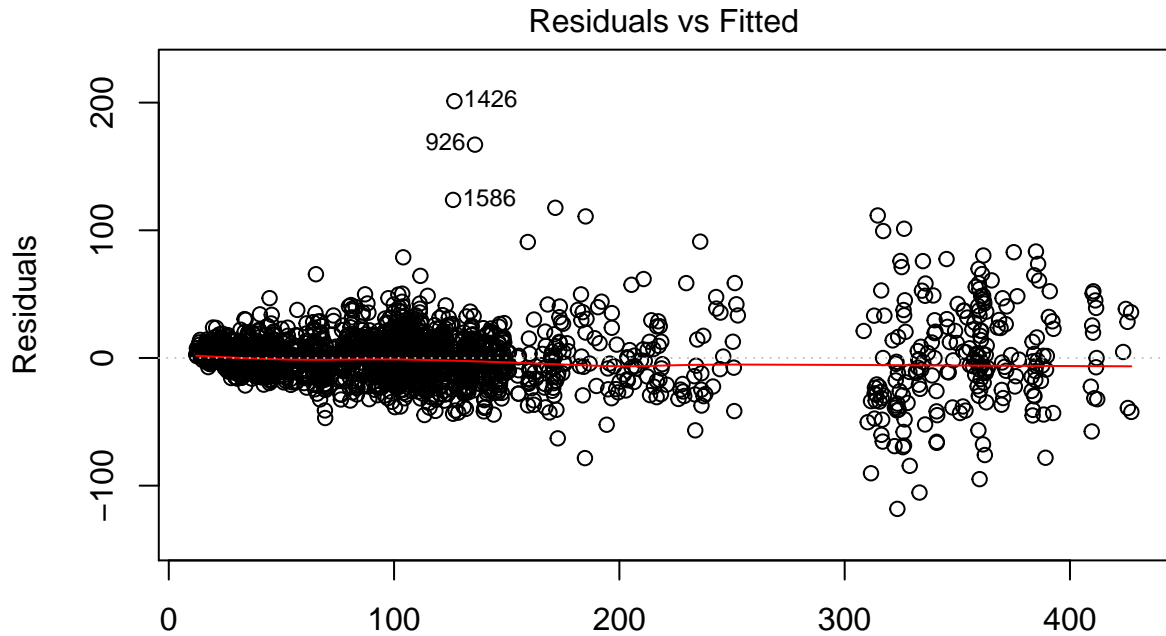
## Warning in commonArgs(par, fn, control, environment()): maxfun < 10 *
## length(par)^2 is not recommended.
##
## Warning in optwrap(optimizer, devfun, getStart(start, rho$lower, rho$pp), :
## convergence code 1 from bobyqa: bobyqa -- maximum number of function
## evaluations exceeded
##
## Warning in commonArgs(par, fn, control, environment()): maxfun < 10 *
## length(par)^2 is not recommended.
## singular fit
summary(randonmeffect)

## Linear mixed model fit by REML ['lmerMod']
## Formula: log(uterus) ~ log(weight) + protocol + EE + ZM + (1 + EE + ZM |
##      lab)
## Data: bioassay_lm
##
```

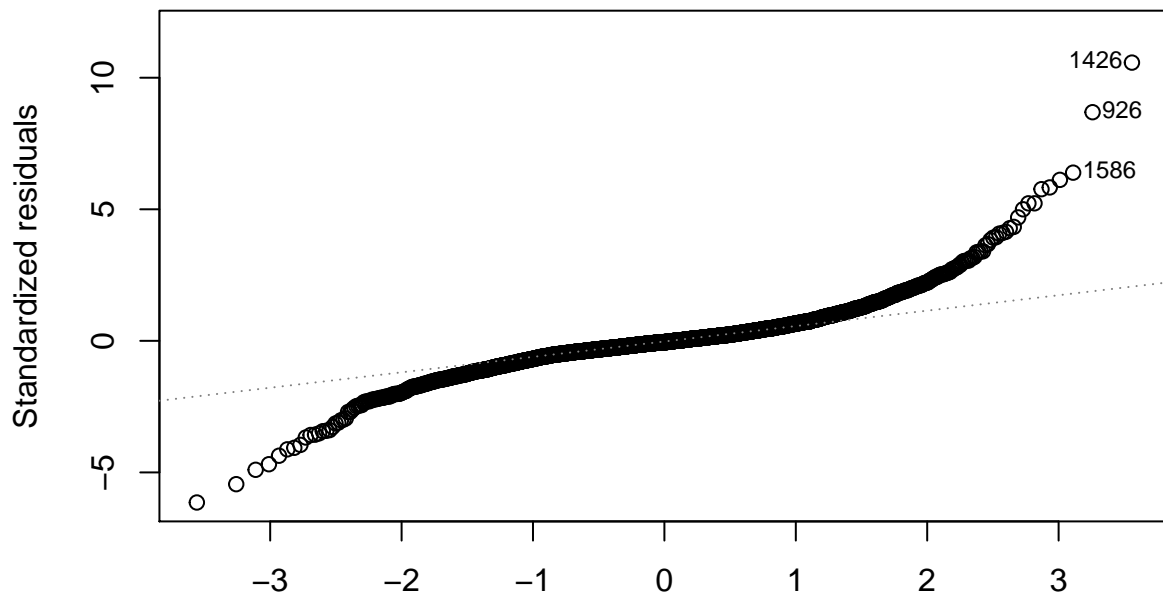




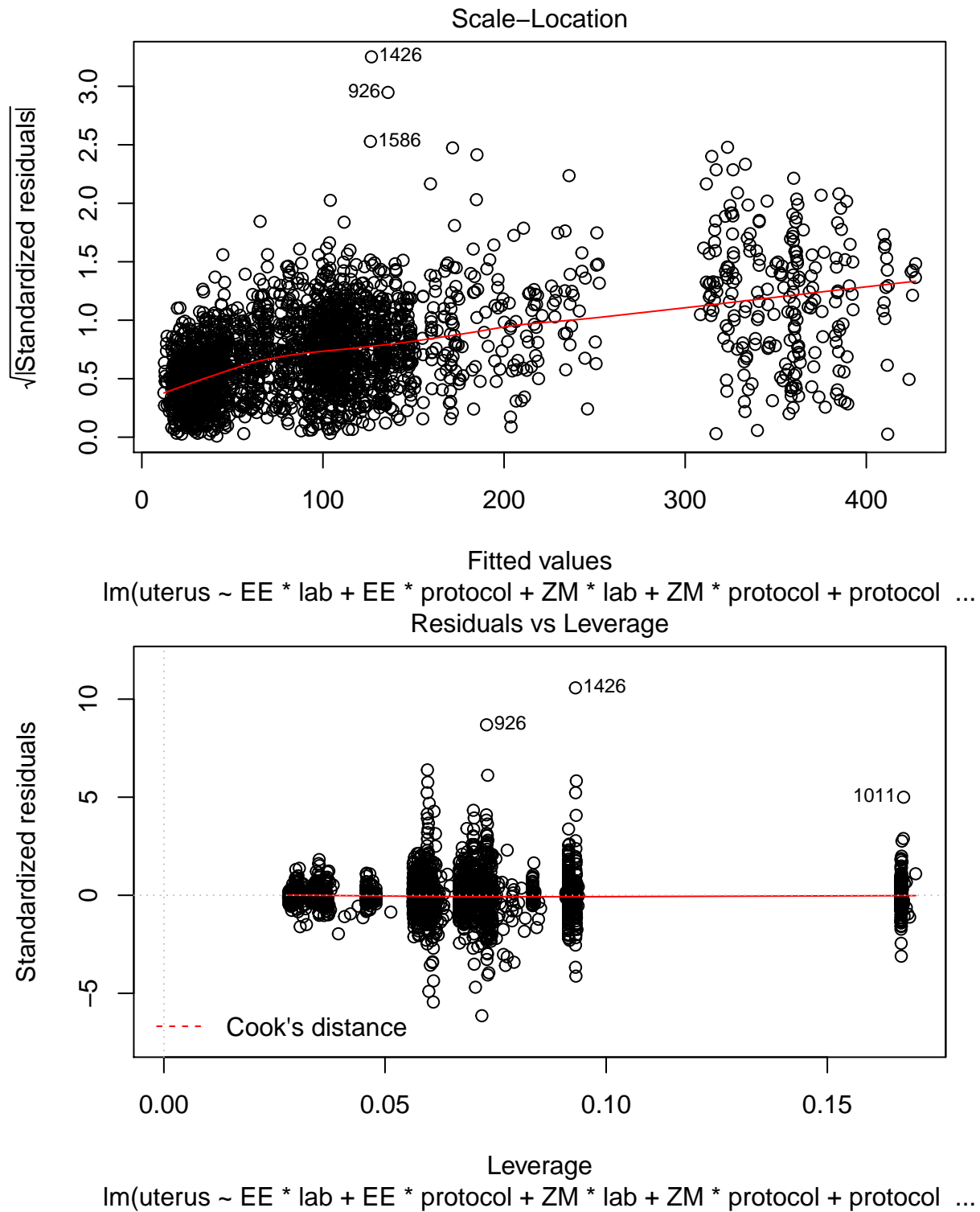
```
## convergence code: 0
## singular fit
## maxfun < 10 * length(par)^2 is not recommended.
lm.full = lm(uterus~EE*lab+EE*protocol+ZM*lab+ZM*protocol+protocol+weight, data = bioassay)
plot(lm.full)
```



lm(uterus ~ EE \* lab + EE \* protocol + ZM \* lab + ZM \* protocol + protocol ...  
Normal Q-Q



lm(uterus ~ EE \* lab + EE \* protocol + ZM \* lab + ZM \* protocol + protocol ...



a.

Is the uterotrophic bioassay successful overall at identifying estrogenic effects of EE and anti-estrogenic effects of ZM? Do some labs fail to detect such effects? At what dose level of EE is there a change relative to the control and does this level vary across labs?

```
anova(lm.full)
```

```
## Analysis of Variance Table
```

```
##
```

```
## Response: uterus
```

```
##           Df Sum Sq Mean Sq F value    Pr(>F)
## EE           7 6461242  923035 2314.192 < 2.2e-16 ***
## lab          18 2425580  134754  337.851 < 2.2e-16 ***
## protocol     3 7417598 2472533 6199.025 < 2.2e-16 ***
## ZM           2 2088738 1044369 2618.396 < 2.2e-16 ***
## weight       1  117187  117187  293.805 < 2.2e-16 ***
## EE:lab       123  872697    7095   17.788 < 2.2e-16 ***
## EE:protocol  21 1644774   78323  196.367 < 2.2e-16 ***
## lab:ZM       36  434688   12075   30.273 < 2.2e-16 ***
## protocol:ZM  6  635763  105960  265.659 < 2.2e-16 ***
## Residuals   2459 980793    399
```

```
## ---
```

```
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
coefs = summary(lm.full)$coefficients %>% data.frame()
colnames(coefs)=c("Estimate", "Std.Error", "t.value", "P.value")
kable(coefs)
```

|             | Estimate    | Std.Error  | t.value    | P.value   |
|-------------|-------------|------------|------------|-----------|
| (Intercept) | 17.6921398  | 6.2283464  | 2.8405838  | 0.0045402 |
| EE0.01      | 1.7701399   | 6.3709462  | 0.2778457  | 0.7811542 |
| EE0.03      | 1.0378908   | 10.1359258 | 0.1023972  | 0.9184497 |
| EE0.1       | 2.7432160   | 10.1361787 | 0.2706361  | 0.7866936 |
| EE0.3       | -1.2249771  | 10.1358912 | -0.1208554 | 0.9038155 |
| EE1         | 4.9154699   | 10.1358996 | 0.4849565  | 0.6277504 |
| EE3         | 69.3115588  | 10.1360074 | 6.8381520  | 0.0000000 |
| EE10        | 85.6371823  | 10.1363218 | 8.4485461  | 0.0000000 |
| labBayer    | 13.5599357  | 8.3484811  | 1.6242399  | 0.1044528 |
| labBerlin   | 5.1255856   | 8.3655611  | 0.6127008  | 0.5401309 |
| labChungKor | 16.9958608  | 7.3875081  | 2.3006216  | 0.0214963 |
| labCitfranc | 19.9135236  | 8.3366042  | 2.3886853  | 0.0169838 |
| labCitijapa | 13.4429984  | 7.0580652  | 1.9046294  | 0.0569448 |
| labDenmark  | 9.5877157   | 8.7221893  | 1.0992327  | 0.2717742 |
| labExxon    | 15.6604413  | 10.1361133 | 1.5450144  | 0.1224714 |
| labHatano   | 11.9498140  | 6.9083411  | 1.7297661  | 0.0837976 |
| labHuntingd | -8.1394636  | 9.0112917  | -0.9032516 | 0.3664809 |
| labInEnvTox | 4.7193764   | 6.9572738  | 0.6783370  | 0.4976219 |
| labKoreaPar | -2.4460044  | 7.6562213  | -0.3194793 | 0.7493902 |
| labMitsubis | 11.9576775  | 6.9093842  | 1.7306430  | 0.0836409 |
| labNihon    | 5.9004474   | 6.9097671  | 0.8539286  | 0.3932278 |
| labPoulenc  | -3.8767398  | 8.3457355  | -0.4645175 | 0.6423182 |
| labSumitomo | 10.7102334  | 7.0571585  | 1.5176411  | 0.1292335 |
| labTNO      | 5.1244311   | 7.4554856  | 0.6873370  | 0.4919352 |
| labWIL      | 6.7280809   | 7.3900800  | 0.9104206  | 0.3626900 |
| labZeneca   | -4.0076574  | 7.0778683  | -0.5662238 | 0.5712933 |
| protocolB   | -2.1610930  | 2.5551149  | -0.8457909 | 0.3977517 |
| protocolC   | 57.4966953  | 5.5324392  | 10.3926483 | 0.0000000 |
| protocolD   | 47.8797880  | 6.3029055  | 7.5964629  | 0.0000000 |
| ZM0.1       | -44.2666292 | 11.5305487 | -3.8390739 | 0.0001266 |

|                    | Estimate    | Std.Error  | t.value    | P.value   |
|--------------------|-------------|------------|------------|-----------|
| ZM1                | -68.4672254 | 11.5305183 | -5.9379140 | 0.0000000 |
| weight             | 0.0983238   | 0.0275887  | 3.5639120  | 0.0003723 |
| EE0.1:labBayer     | -1.9413540  | 14.2285737 | -0.1364405 | 0.8914842 |
| EE0.3:labBayer     | -1.0759172  | 14.2286635 | -0.0756162 | 0.9397306 |
| EE1:labBayer       | 2.4327603   | 14.2289689 | 0.1709724  | 0.8642596 |
| EE3:labBayer       | -28.2053769 | 14.2285472 | -1.9823090 | 0.0475558 |
| EE10:labBayer      | 13.3718307  | 14.2288133 | 0.9397713  | 0.3474272 |
| EE0.01:labBerlin   | -0.8718434  | 11.8448246 | -0.0736054 | 0.9413303 |
| EE0.03:labBerlin   | 2.9065320   | 14.2285241 | 0.2042750  | 0.8381555 |
| EE0.1:labBerlin    | -2.7973588  | 14.2292670 | -0.1965919 | 0.8441631 |
| EE0.3:labBerlin    | 15.6309460  | 14.2286601 | 1.0985536  | 0.2720704 |
| EE1:labBerlin      | 49.4838691  | 14.2285209 | 3.4777943  | 0.0005143 |
| EE3:labBerlin      | 36.1929758  | 14.2286878 | 2.5436622  | 0.0110304 |
| EE10:labBerlin     | 5.9541129   | 14.2302966 | 0.4184110  | 0.6756832 |
| EE0.01:labChungKor | -4.4227978  | 9.2334220  | -0.4789988 | 0.6319821 |
| EE0.03:labChungKor | 3.6542317   | 12.5489789 | 0.2911975  | 0.7709248 |
| EE0.1:labChungKor  | 25.0578867  | 12.5492986 | 1.9967560  | 0.0459618 |
| EE0.3:labChungKor  | 29.9631938  | 12.5490889 | 2.3876788  | 0.0170302 |
| EE1:labChungKor    | 33.4866563  | 12.5490107 | 2.6684698  | 0.0076698 |
| EE3:labChungKor    | 5.8794592   | 12.5491838 | 0.4685133  | 0.6394591 |
| EE10:labChungKor   | -13.1302296 | 12.5500788 | -1.0462269 | 0.2955591 |
| EE0.01:labCitfranc | -5.4673561  | 11.8451179 | -0.4615704 | 0.6444302 |
| EE0.03:labCitfranc | 2.1025749   | 14.2285222 | 0.1477718  | 0.8825350 |
| EE0.1:labCitfranc  | -4.7655344  | 14.2287442 | -0.3349230 | 0.7377117 |
| EE0.3:labCitfranc  | 4.4900701   | 14.2285349 | 0.3155680  | 0.7523572 |
| EE1:labCitfranc    | 15.3965133  | 14.2285406 | 1.0820866  | 0.2793201 |
| EE3:labCitfranc    | -11.4516245 | 14.2285356 | -0.8048351 | 0.4209927 |
| EE10:labCitfranc   | 12.3238231  | 14.2286889 | 0.8661250  | 0.3865061 |
| EE0.01:labCitijapa | -3.0235543  | 8.1536667  | -0.3708214 | 0.7108025 |
| EE0.03:labCitijapa | -4.5859463  | 11.9717926 | -0.3830626 | 0.7017064 |
| EE0.1:labCitijapa  | -7.0987885  | 11.9718389 | -0.5929572 | 0.5532643 |
| EE0.3:labCitijapa  | -3.2750500  | 11.9716979 | -0.2735660 | 0.7844411 |
| EE1:labCitijapa    | 35.0612365  | 11.9718333 | 2.9286439  | 0.0034357 |
| EE3:labCitijapa    | 5.0500990   | 11.9716950 | 0.4218366  | 0.6731812 |
| EE10:labCitijapa   | 10.5680912  | 11.9720931 | 0.8827271  | 0.3774700 |
| EE0.01:labDenmark  | -2.1156506  | 11.8184115 | -0.1790131 | 0.8579422 |
| EE0.03:labDenmark  | -3.8716071  | 14.8992290 | -0.2598528 | 0.7949990 |
| EE0.1:labDenmark   | -5.4275941  | 14.8990603 | -0.3642910 | 0.7156720 |
| EE0.3:labDenmark   | 27.6907502  | 14.8990352 | 1.8585600  | 0.0632089 |
| EE1:labDenmark     | 40.2481584  | 14.8993790 | 2.7013313  | 0.0069536 |
| EE3:labDenmark     | 8.8724601   | 14.8991321 | 0.5955018  | 0.5515629 |
| EE10:labDenmark    | -2.3083513  | 14.9025781 | -0.1548961 | 0.8769159 |
| EE0.01:labExxon    | 5.2408100   | 13.1734606 | 0.3978309  | 0.6907894 |
| EE0.03:labExxon    | 0.6638228   | 15.3521914 | 0.0432396  | 0.9655140 |
| EE0.1:labExxon     | -0.3674801  | 15.3526063 | -0.0239360 | 0.9809056 |
| EE0.3:labExxon     | 9.4632641   | 15.3521774 | 0.6164119  | 0.5376798 |
| EE1:labExxon       | 11.9086272  | 15.3521859 | 0.7756959  | 0.4380032 |
| EE3:labExxon       | 5.4879948   | 15.3526675 | 0.3574620  | 0.7207767 |
| EE10:labExxon      | 14.6811231  | 15.3524493 | 0.9562724  | 0.3390286 |
| EE0.01:labHatano   | -3.1391717  | 7.7623171  | -0.4044117 | 0.6859452 |
| EE0.03:labHatano   | -3.6455000  | 11.7106696 | -0.3112973 | 0.7556010 |
| EE0.1:labHatano    | 2.0072571   | 11.7085264 | 0.1714355  | 0.8638954 |

|                    | Estimate     | Std.Error  | t.value     | P.value   |
|--------------------|--------------|------------|-------------|-----------|
| EE0.3:labHatano    | 2.9241566    | 11.7085297 | 0.2497458   | 0.8028048 |
| EE1:labHatano      | 25.9776627   | 11.7086219 | 2.2186781   | 0.0265996 |
| EE3:labHatano      | 14.2692412   | 11.7086377 | 1.2186935   | 0.2230774 |
| EE10:labHatano     | 23.8552606   | 11.7386011 | 2.0322064   | 0.0422400 |
| EE0.01:labHuntingd | 7.8784060    | 11.8975318 | 0.6621883   | 0.5079126 |
| EE0.03:labHuntingd | -5.1408169   | 15.0873643 | -0.3407366  | 0.7333310 |
| EE0.1:labHuntingd  | -32.8815501  | 15.0899176 | -2.1790411  | 0.0294232 |
| EE0.3:labHuntingd  | -91.0178211  | 15.0897691 | -6.0317570  | 0.0000000 |
| EE1:labHuntingd    | -151.3054403 | 15.0872126 | -10.0287206 | 0.0000000 |
| EE3:labHuntingd    | -101.1249020 | 15.0935628 | -6.6998695  | 0.0000000 |
| EE10:labHuntingd   | -5.2949207   | 15.0890160 | -0.3509123  | 0.7256842 |
| EE0.01:labInEnvTox | -5.5062872   | 7.7618711  | -0.7094020  | 0.4781423 |
| EE0.03:labInEnvTox | -2.5009443   | 11.7105266 | -0.2135638  | 0.8309050 |
| EE0.1:labInEnvTox  | -0.3415523   | 11.7096969 | -0.0291683  | 0.9767327 |
| EE0.3:labInEnvTox  | 8.1049832    | 11.7085361 | 0.6922286   | 0.4888592 |
| EE1:labInEnvTox    | 35.7979406   | 11.7087305 | 3.0573716   | 0.0022569 |
| EE3:labInEnvTox    | 5.8104777    | 11.7090811 | 0.4962369   | 0.6197717 |
| EE10:labInEnvTox   | -5.1453068   | 11.7092036 | -0.4394241  | 0.6603928 |
| EE0.01:labKoreaPar | -4.5648235   | 9.2159706  | -0.4953166  | 0.6204209 |
| EE0.03:labKoreaPar | -9.0478787   | 13.0047842 | -0.6957346  | 0.4866608 |
| EE0.1:labKoreaPar  | -13.5687159  | 13.0051963 | -1.0433303  | 0.2968979 |
| EE0.3:labKoreaPar  | -8.2118046   | 13.0047840 | -0.6314449  | 0.5278084 |
| EE1:labKoreaPar    | 32.4992463   | 13.0049905 | 2.4989827   | 0.0125198 |
| EE3:labKoreaPar    | -5.6884006   | 13.0054179 | -0.4373870  | 0.6618691 |
| EE10:labKoreaPar   | 10.6822373   | 13.0061162 | 0.8213242   | 0.4115413 |
| EE0.01:labMitsubis | -6.9672860   | 7.7620864  | -0.8976048  | 0.3694842 |
| EE0.03:labMitsubis | -3.6538049   | 11.7266100 | -0.3115824  | 0.7553844 |
| EE0.1:labMitsubis  | -2.4379617   | 11.7085261 | -0.2082211  | 0.8350736 |
| EE0.3:labMitsubis  | 10.1457484   | 11.7086923 | 0.8665142   | 0.3862928 |
| EE1:labMitsubis    | 23.9905950   | 11.7092995 | 2.0488497   | 0.0405827 |
| EE3:labMitsubis    | 12.0136442   | 11.7089145 | 1.0260254   | 0.3049805 |
| EE10:labMitsubis   | 10.1939679   | 11.7086648 | 0.8706345   | 0.3840387 |
| EE0.01:labNihon    | 1.1342292    | 7.7622619  | 0.1461210   | 0.8838379 |
| EE0.03:labNihon    | -6.8542963   | 11.7105338 | -0.5853103  | 0.5583928 |
| EE0.1:labNihon     | -11.0475122  | 11.7086265 | -0.9435361  | 0.3454994 |
| EE0.3:labNihon     | -4.3192633   | 11.7087772 | -0.3688911  | 0.7122407 |
| EE1:labNihon       | 22.3176093   | 11.7085636 | 1.9060928   | 0.0567546 |
| EE3:labNihon       | 16.6960124   | 11.7085405 | 1.4259687   | 0.1540043 |
| EE10:labNihon      | 16.7156938   | 11.7087850 | 1.4276198   | 0.1535283 |
| EE0.01:labPoulenc  | -2.6767783   | 11.8448384 | -0.2259869  | 0.8212304 |
| EE0.03:labPoulenc  | -1.0819782   | 14.2285209 | -0.0760429  | 0.9393911 |
| EE0.1:labPoulenc   | -2.1250690   | 14.2286472 | -0.1493514  | 0.8812886 |
| EE0.3:labPoulenc   | 15.6299768   | 14.2286052 | 1.0984897   | 0.2720982 |
| EE1:labPoulenc     | 31.5497164   | 14.2285209 | 2.2173574   | 0.0266898 |
| EE3:labPoulenc     | -17.8746600  | 14.2285859 | -1.2562499  | 0.2091447 |
| EE10:labPoulenc    | -25.6318658  | 14.2287762 | -1.8014104  | 0.0717607 |
| EE0.01:labSumitomo | -0.7795783   | 8.1534741  | -0.0956130  | 0.9238357 |
| EE0.03:labSumitomo | -1.5687737   | 11.9717781 | -0.1310393  | 0.8957549 |
| EE0.1:labSumitomo  | -6.9354396   | 11.9718635 | -0.5793116  | 0.5624320 |
| EE0.3:labSumitomo  | 11.7092981   | 11.9717402 | 0.9780782   | 0.3281319 |
| EE1:labSumitomo    | 42.0312958   | 11.9716966 | 3.5108888   | 0.0004546 |
| EE3:labSumitomo    | 24.4538517   | 11.9717859 | 2.0426235   | 0.0411962 |

|                   | Estimate    | Std.Error  | t.value    | P.value   |
|-------------------|-------------|------------|------------|-----------|
| EE10:labSumitomo  | 35.6596086  | 11.9720722 | 2.9785661  | 0.0029243 |
| EE0.01:labTNO     | 0.1409306   | 9.2719005  | 0.0151998  | 0.9878740 |
| EE0.03:labTNO     | -0.9350942  | 12.5834691 | -0.0743113 | 0.9407687 |
| EE0.1:labTNO      | -5.5913465  | 12.5836286 | -0.4443350 | 0.6568395 |
| EE0.3:labTNO      | 2.7513260   | 12.5835230 | 0.2186451  | 0.8269446 |
| EE1:labTNO        | 32.7382800  | 12.5835389 | 2.6016751  | 0.0093326 |
| EE3:labTNO        | 10.9601235  | 12.5835070 | 0.8709912  | 0.3838440 |
| EE10:labTNO       | 20.5192902  | 12.5849485 | 1.6304628  | 0.1031318 |
| EE0.01:labWIL     | 2.3879433   | 9.2328247  | 0.2586363  | 0.7959375 |
| EE0.03:labWIL     | -0.9964710  | 12.5489507 | -0.0794067 | 0.9367156 |
| EE0.1:labWIL      | 1.5719326   | 12.5495817 | 0.1252578  | 0.9003297 |
| EE0.3:labWIL      | -0.5850968  | 12.5490251 | -0.0466249 | 0.9628160 |
| EE1:labWIL        | 13.0474996  | 12.5490457 | 1.0397205  | 0.2985720 |
| EE3:labWIL        | -12.0028171 | 12.5493560 | -0.9564488 | 0.3389395 |
| EE10:labWIL       | 4.3168054   | 12.5506409 | 0.3439510  | 0.7309125 |
| EE0.03:labZeneca  | 0.2451555   | 11.9717933 | 0.0204778  | 0.9836639 |
| EE0.1:labZeneca   | 0.1782602   | 11.9720517 | 0.0148897  | 0.9881214 |
| EE0.3:labZeneca   | 13.2683860  | 11.9717127 | 1.1083114  | 0.2678357 |
| EE1:labZeneca     | 21.7897069  | 11.9717082 | 1.8201001  | 0.0688653 |
| EE3:labZeneca     | -23.5535783 | 11.9719315 | -1.9674000 | 0.0492494 |
| EE10:labZeneca    | -16.8965915 | 11.9726142 | -1.4112700 | 0.1582915 |
| EE0.01:protocolB  | 1.1902964   | 4.4193150  | 0.2693396  | 0.7876910 |
| EE0.03:protocolB  | 3.5418537   | 4.4193120  | 0.8014491  | 0.4229491 |
| EE0.1:protocolB   | 7.5900388   | 4.4193228  | 1.7174665  | 0.0860199 |
| EE0.3:protocolB   | 35.0978767  | 4.4193110  | 7.9419340  | 0.0000000 |
| EE1:protocolB     | 58.2124603  | 4.4193491  | 13.1721796 | 0.0000000 |
| EE3:protocolB     | 34.4012138  | 4.4193376  | 7.7842466  | 0.0000000 |
| EE10:protocolB    | 17.5737941  | 4.4312030  | 3.9659194  | 0.0000752 |
| EE0.01:protocolC  | -0.3219158  | 5.0172722  | -0.0641615 | 0.9488468 |
| EE0.03:protocolC  | 2.7235600   | 5.0172696  | 0.5428371  | 0.5872912 |
| EE0.1:protocolC   | 16.8961376  | 5.0181550  | 3.3670020  | 0.0007716 |
| EE0.3:protocolC   | 100.1908816 | 5.0179722  | 19.9664084 | 0.0000000 |
| EE1:protocolC     | 186.2703041 | 5.0226183  | 37.0862953 | 0.0000000 |
| EE3:protocolC     | 169.9677193 | 5.0320482  | 33.7770454 | 0.0000000 |
| EE10:protocolC    | 157.5051103 | 5.0391674  | 31.2561773 | 0.0000000 |
| EE0.01:protocolD  | 6.4555202   | 6.3706594  | 1.0133206  | 0.3110068 |
| EE0.03:protocolD  | 4.8354220   | 6.4292086  | 0.7521022  | 0.4520616 |
| EE0.1:protocolD   | 31.1032766  | 6.3778672  | 4.8767520  | 0.0000011 |
| EE0.3:protocolD   | 140.9528162 | 6.3802058  | 22.0922054 | 0.0000000 |
| EE1:protocolD     | 230.4597903 | 6.4081260  | 35.9636793 | 0.0000000 |
| EE3:protocolD     | 208.0722058 | 6.4268844  | 32.3752835 | 0.0000000 |
| EE10:protocolD    | 216.8698781 | 6.4449178  | 33.6497509 | 0.0000000 |
| labBayer:ZM0.1    | 50.8815276  | 16.3068064 | 3.1202632  | 0.0018279 |
| labBerlin:ZM0.1   | 27.7245810  | 16.3066116 | 1.7002049  | 0.0892188 |
| labChungKor:ZM0.1 | 57.6875289  | 14.3503878 | 4.0199282  | 0.0000600 |
| labCitfranc:ZM0.1 | 30.2092368  | 16.3066650 | 1.8525699  | 0.0640638 |
| labCitijapa:ZM0.1 | 31.7989098  | 13.6778097 | 2.3248539  | 0.0201608 |
| labDenmark:ZM0.1  | 23.1363620  | 17.0854082 | 1.3541592  | 0.1758100 |
| labExxon:ZM0.1    | 23.0558838  | 16.3068879 | 1.4138739  | 0.1575255 |
| labHatano:ZM0.1   | 8.9988335   | 13.3922313 | 0.6719443  | 0.5016823 |
| labHuntingd:ZM0.1 | 72.4267174  | 17.3109743 | 4.1838614  | 0.0000297 |
| labInEnvTox:ZM0.1 | 23.3265475  | 13.3699157 | 1.7447041  | 0.0811613 |

|                   | Estimate     | Std.Error  | t.value     | P.value   |
|-------------------|--------------|------------|-------------|-----------|
| labKoreaPar:ZM0.1 | 16.1575276   | 14.8832064 | 1.0856214   | 0.2777529 |
| labMitsubis:ZM0.1 | 13.2488798   | 13.3699161 | 0.9909471   | 0.3218089 |
| labNihon:ZM0.1    | 12.5911189   | 13.3699609 | 0.9417469   | 0.3464148 |
| labPoulenc:ZM0.1  | 49.0120298   | 16.3066112 | 3.0056539   | 0.0026769 |
| labSumitomo:ZM0.1 | 30.8721871   | 13.6778934 | 2.2570864   | 0.0240901 |
| labTNO:ZM0.1      | 77.4752572   | 14.3503263 | 5.3988499   | 0.0000001 |
| labWIL:ZM0.1      | 38.1845683   | 14.3502884 | 2.6608921   | 0.0078441 |
| labZeneca:ZM0.1   | 77.9483444   | 13.6782162 | 5.6987215   | 0.0000000 |
| labBayer:ZM1      | 32.7808940   | 16.3066168 | 2.0102817   | 0.0445104 |
| labBerlin:ZM1     | -2.2204654   | 16.3066221 | -0.1361696  | 0.8916984 |
| labChungKor:ZM1   | 33.0188857   | 14.3504195 | 2.3009004   | 0.0214806 |
| labCitfranc:ZM1   | 12.7381194   | 16.3066277 | 0.7811621   | 0.4347824 |
| labCitijapa:ZM1   | 7.7400766    | 13.6768691 | 0.5659246   | 0.5714967 |
| labDenmark:ZM1    | 8.2138615    | 17.0853771 | 0.4807539   | 0.6307342 |
| labExxon:ZM1      | -5.2104660   | 16.3067300 | -0.3195286  | 0.7493529 |
| labHatano:ZM1     | 0.3058017    | 13.3696779 | 0.0228728   | 0.9817536 |
| labHuntingd:ZM1   | 114.0565353  | 17.3048639 | 6.5910103   | 0.0000000 |
| labInEnvTox:ZM1   | 10.2387909   | 13.3696378 | 0.7658241   | 0.4438545 |
| labKoreaPar:ZM1   | 40.0313061   | 14.8813003 | 2.6900409   | 0.0071926 |
| labMitsubis:ZM1   | -5.9903757   | 13.3696378 | -0.4480582  | 0.6541507 |
| labNihon:ZM1      | -4.3205526   | 13.3696532 | -0.3231612  | 0.7466007 |
| labPoulenc:ZM1    | 29.6033149   | 16.3066327 | 1.8154156   | 0.0695818 |
| labSumitomo:ZM1   | -7.6991541   | 13.6769161 | -0.5629306  | 0.5735335 |
| labTNO:ZM1        | 22.6384857   | 14.3502739 | 1.5775647   | 0.1147943 |
| labWIL:ZM1        | 29.8051524   | 14.3502739 | 2.0769745   | 0.0379075 |
| labZeneca:ZM1     | 44.7881960   | 13.6769129 | 3.2747299   | 0.0010723 |
| protocolB:ZM0.1   | -61.0363994  | 5.0994169  | -11.9692900 | 0.0000000 |
| protocolC:ZM0.1   | -158.3876845 | 5.8154616  | -27.2356168 | 0.0000000 |
| protocolD:ZM0.1   | -183.5812617 | 7.3793450  | -24.8777177 | 0.0000000 |
| protocolB:ZM1     | -53.8649790  | 5.0993766  | -10.5630517 | 0.0000000 |
| protocolC:ZM1     | -171.3005189 | 5.7964359  | -29.5527322 | 0.0000000 |
| protocolD:ZM1     | -217.1910191 | 7.3755330  | -29.4475015 | 0.0000000 |

```
t.test(lm.obj = lm.full, str.ee = "EE", str.lab = "lab", str.ori = "lab") %>%
  kable(.,caption = "T-test of EE across labs")
t.test(lm.obj = lm.full, str.ee = "ZM", str.lab = "lab", str.ori = "lab") %>%
  kable(.,caption = "T-test of EE across labs")
```

**b.**

Does the dose response vary across labs? If so, are there certain labs that stand out as being different?

See tables in a.

**c.**

Do the protocols differ in their sensitivity to detecting estrogenic and anti-estrogenic effects? If so, is there one protocol that can be recommended?

See tables in a.

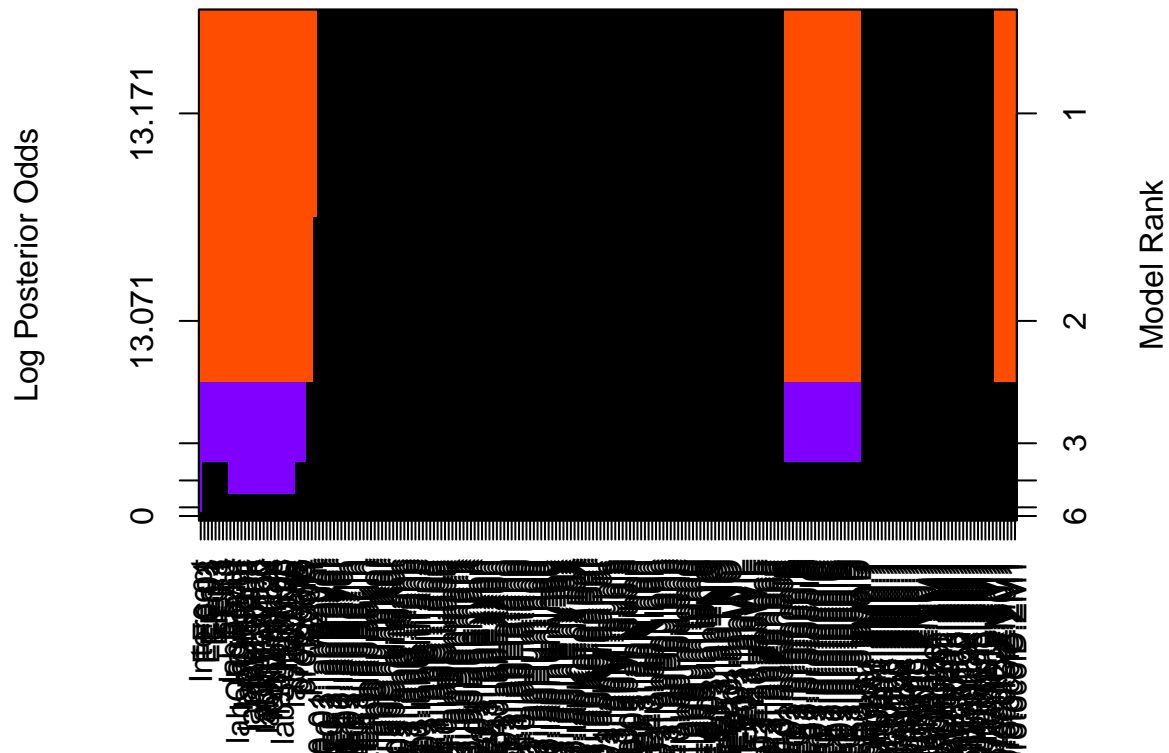


## Model Part II

```
n = nrow(bioassay)
p = ncol(model.matrix(lm.full)) - 1

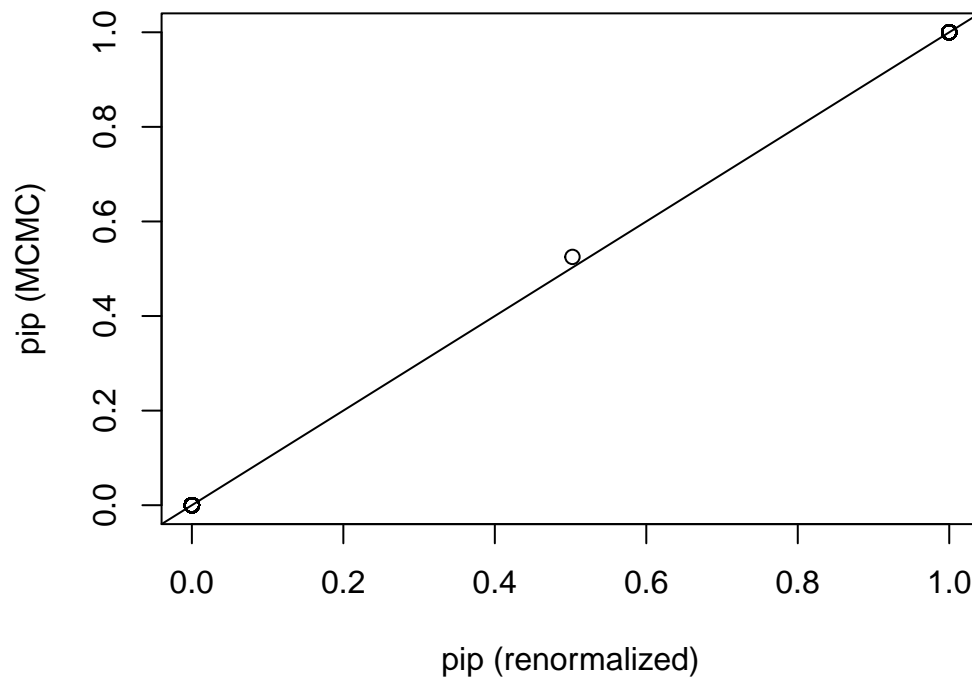
bas1 = bas.lm(uterus~EE*lab+EE*protocol+ZM*lab+ZM*protocol+protocol+weight,
  data = bioassay,
  prior = "hyper-g-n",
  alpha = n,
  method = "MCMC",
  MCMC.iterations = 10^6)
```

```
image(bas1)
```



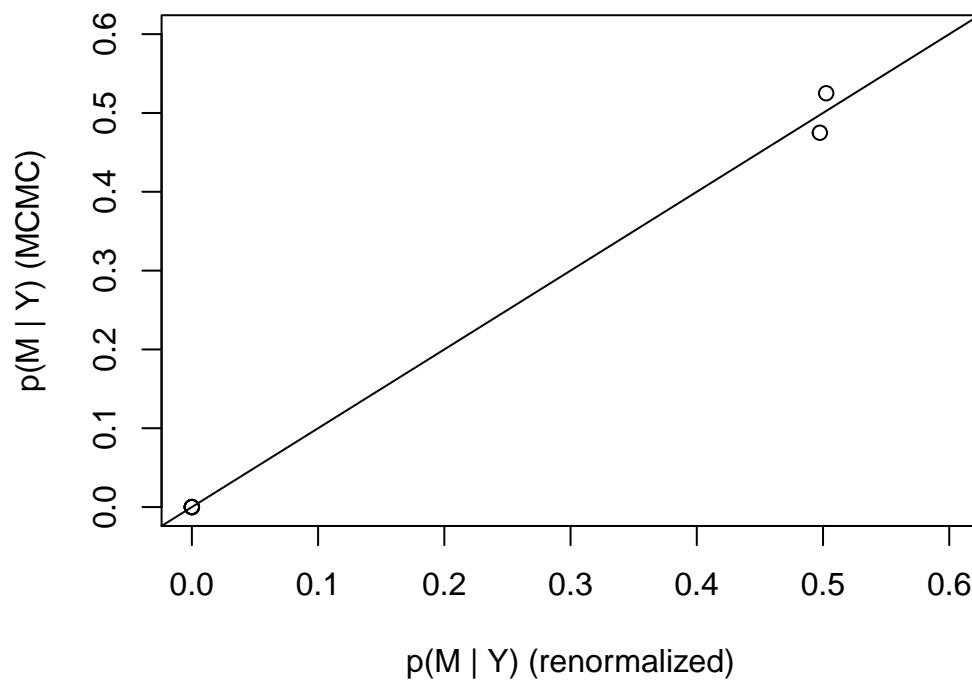
```
diagnostics(bas1, type = "pip")
```

**Convergence Plot: Posterior Inclusion Probabilities**



```
diagnostics(bas1, type = "model")
```

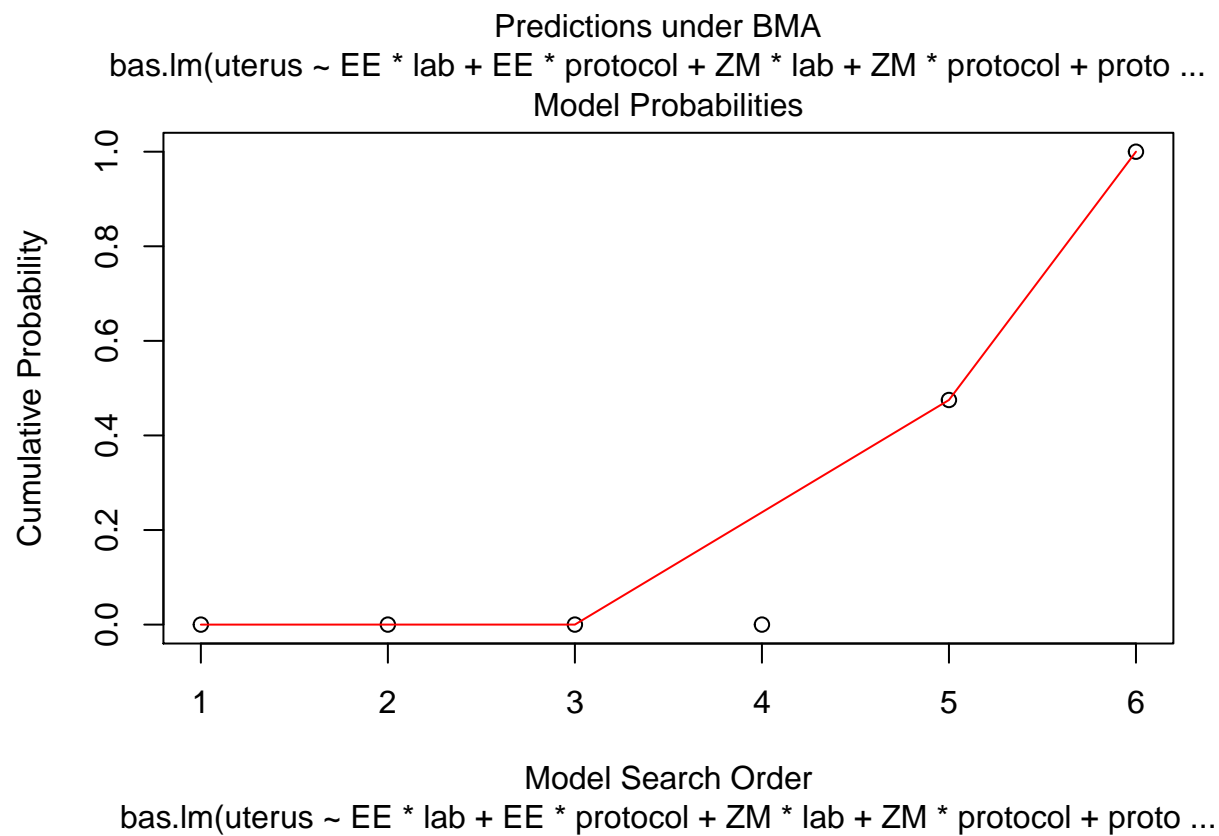
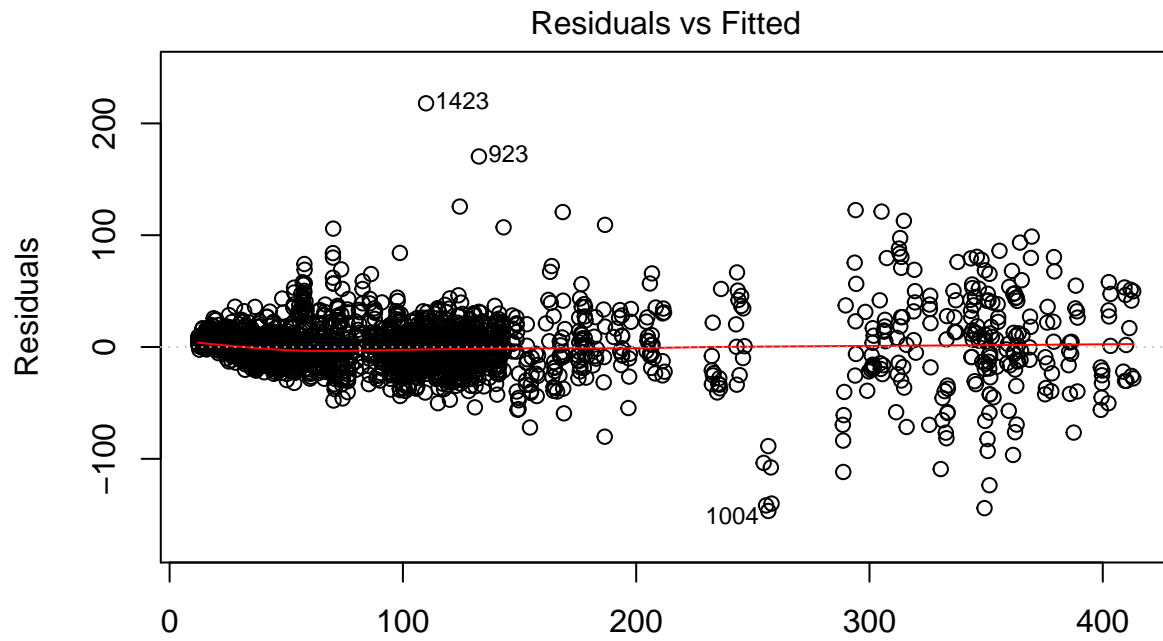
**Convergence Plot: Posterior Model Probabilities**

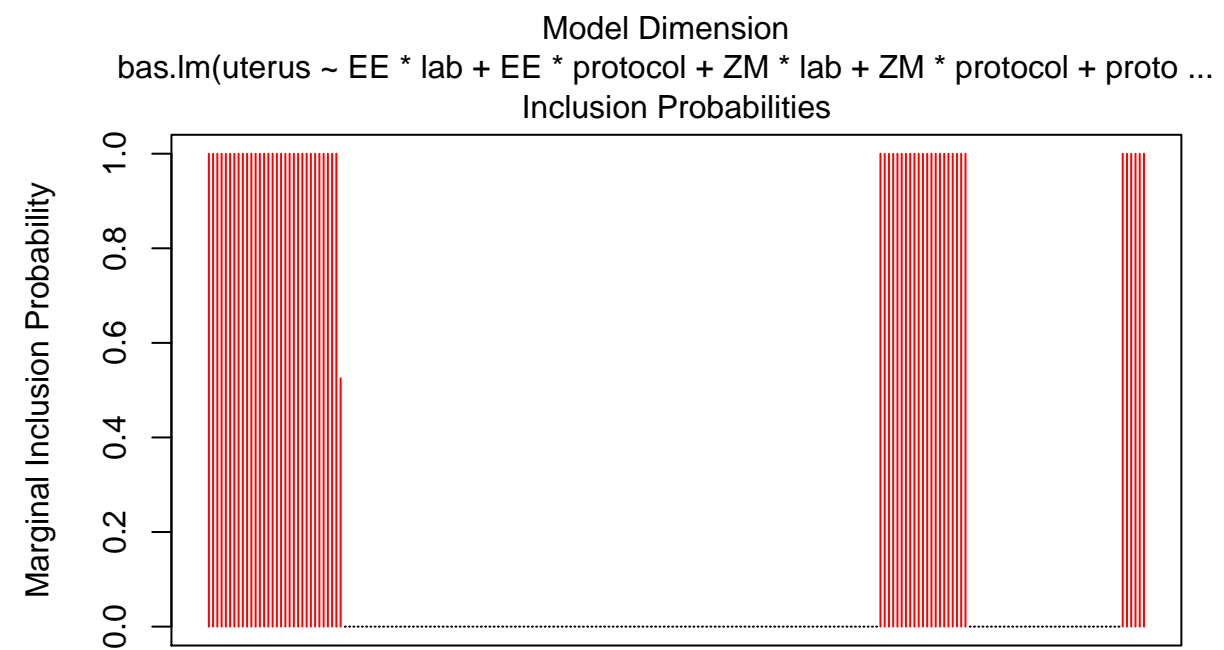
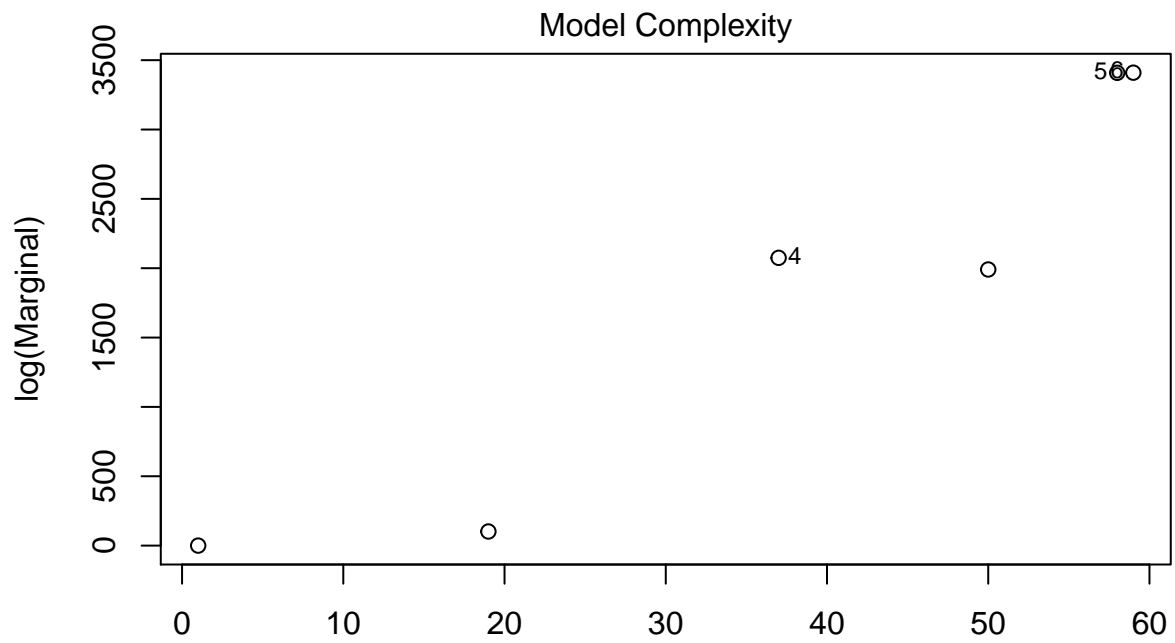


**a.**

Is the uterotrophic bioassay successful overall at identifying estrogenic effects of EE and anti- estrogenic effects of ZM? Do some labs fail to detect such effects? At what dose level of EE is there a change relative to the control and does this level vary across labs?

```
plot(bas1)
```



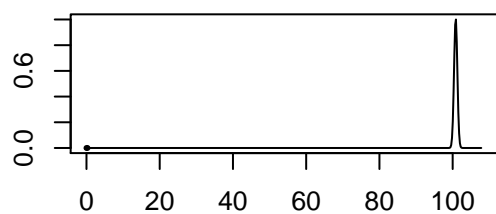


```

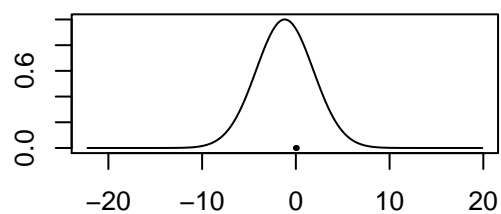
bas.lm(uterus ~ EE * lab + EE * protocol + ZM * lab + ZM * protocol + proto ...
par(mfrow=c(2,2))
plot(coef(bas1), ask=F)

```

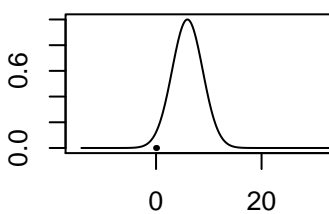
**Intercept**



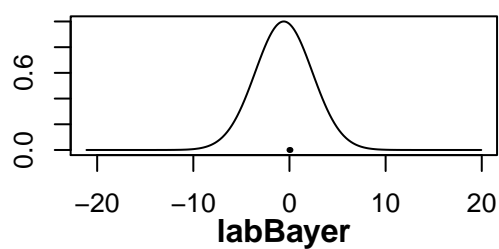
**EE0.01**



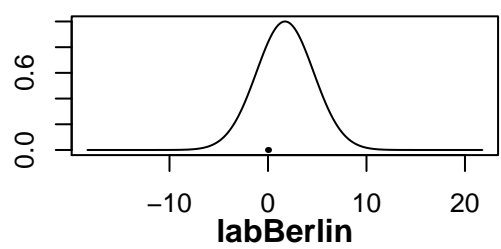
**EE0.3**



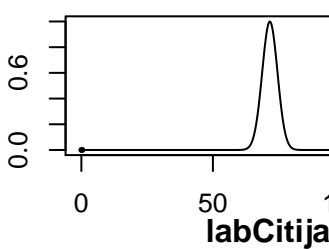
**EE0.03**



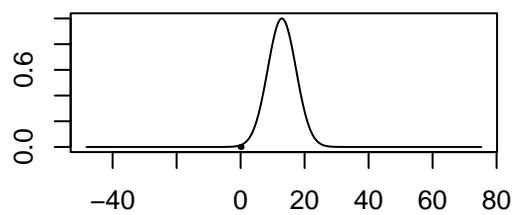
**EE0.1**



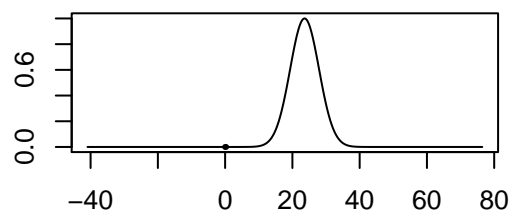
**EE3**



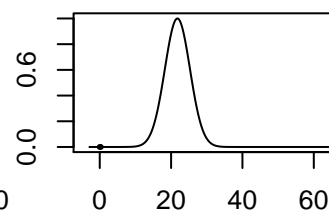
**labBayer**



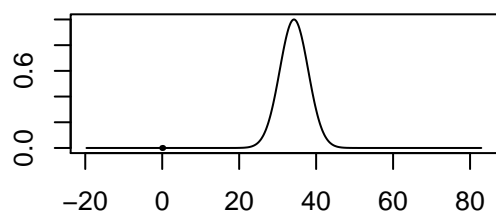
**labBerlin**



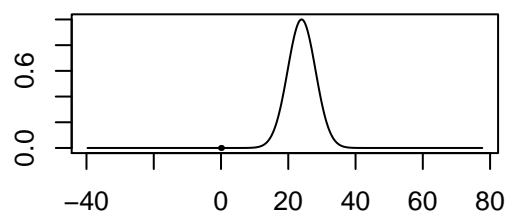
**labCitija**



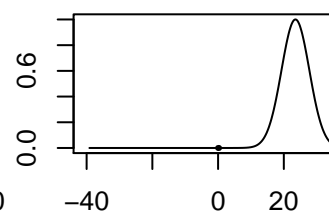
**labChungKor**



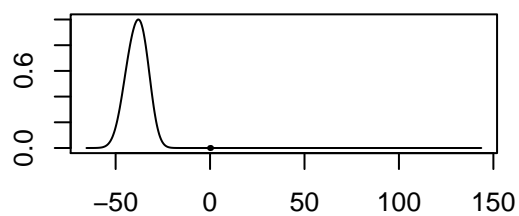
**labCitfranc**



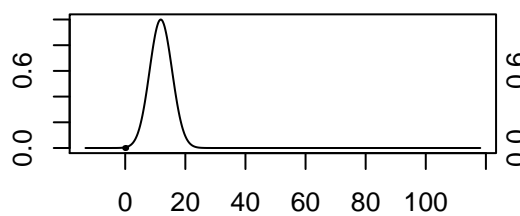
**labExxc**



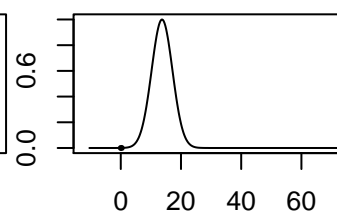
**labHuntingd**



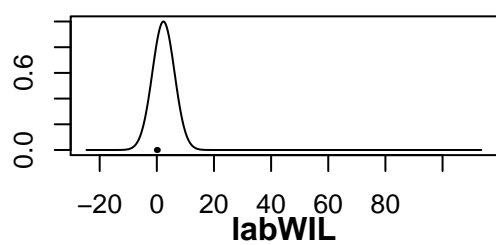
**labInEnvTox**



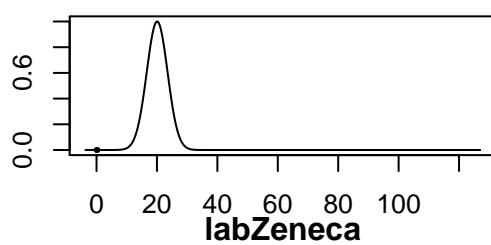
**labNiho**



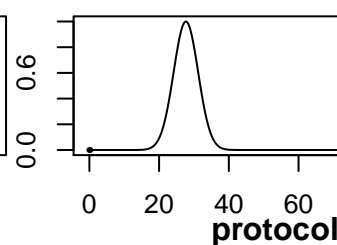
**labKoreaPar**



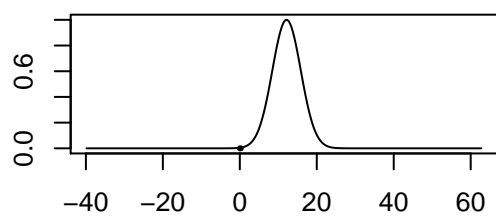
**labMitsubis**



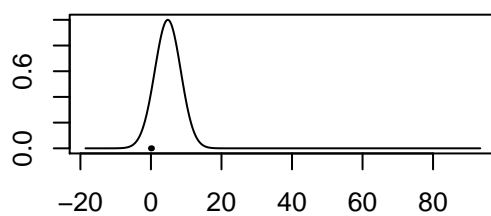
**labSumito**



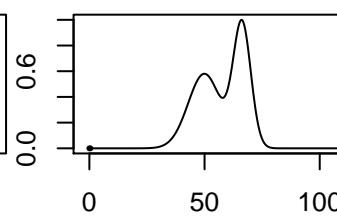
**labWIL**



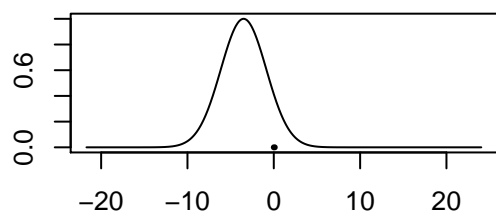
**labZeneca**



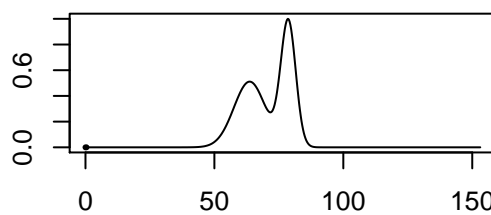
**protocolB**



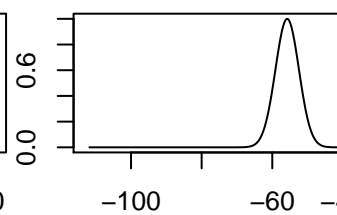
**protocolB**

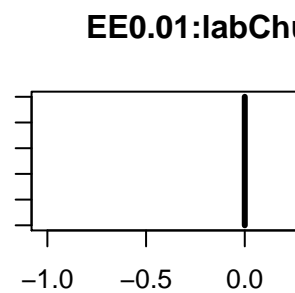
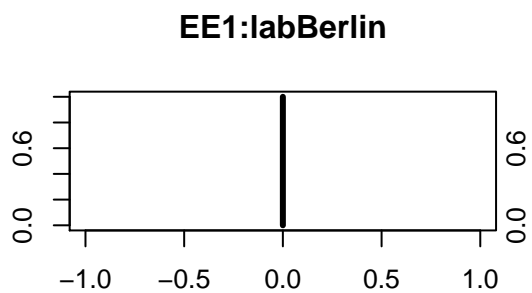
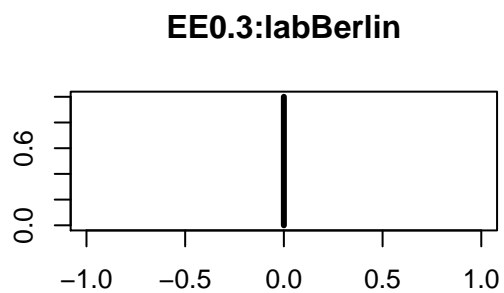
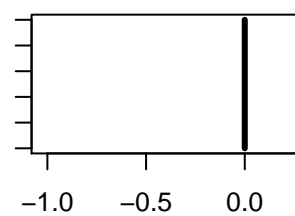
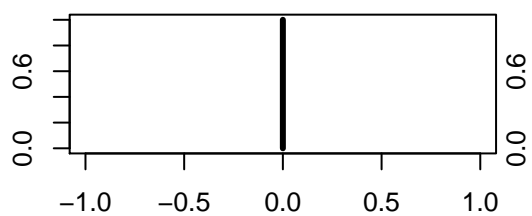
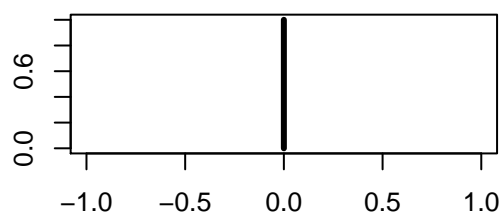
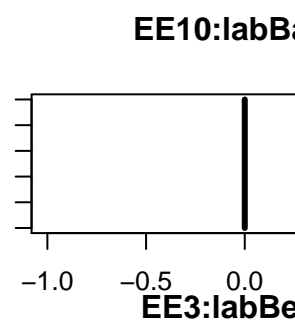
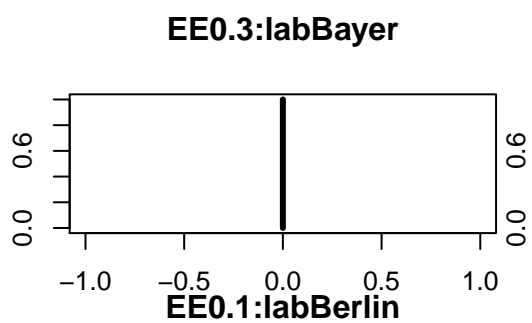
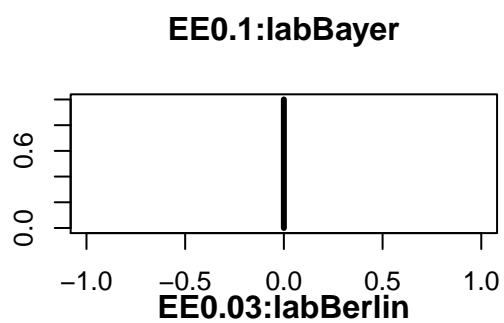
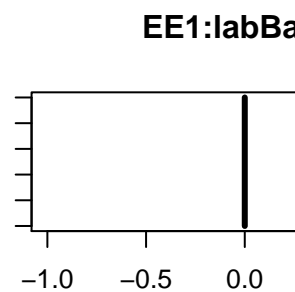
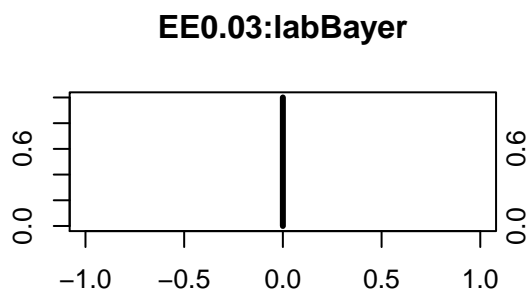
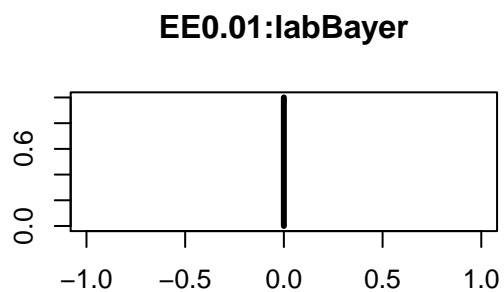


**protocolC**

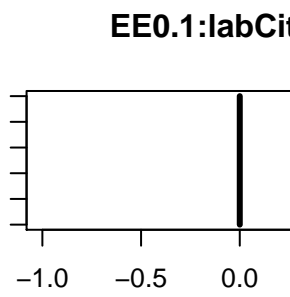
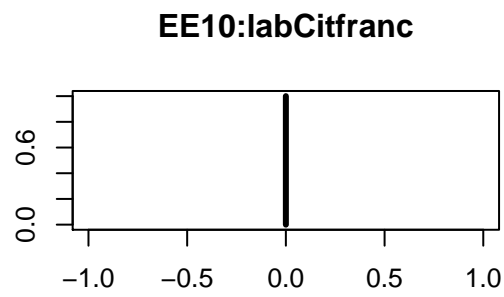
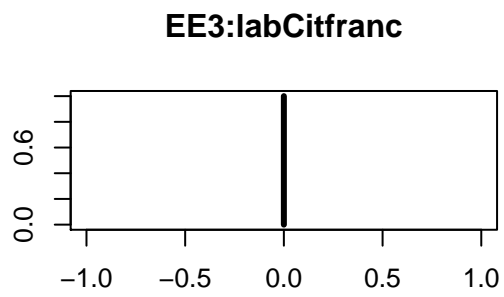
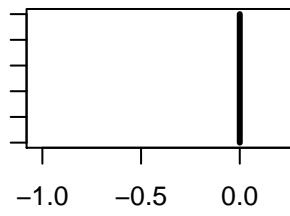
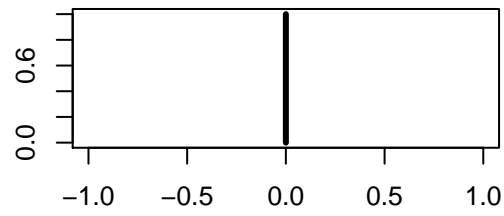
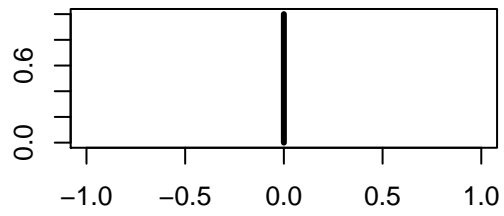
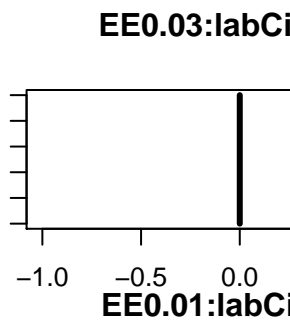
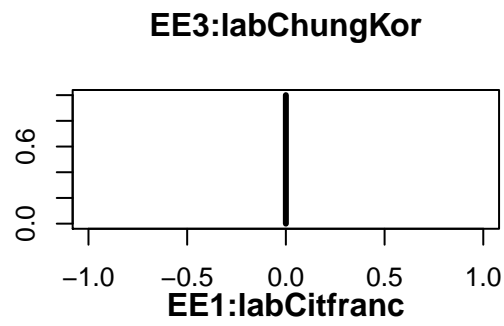
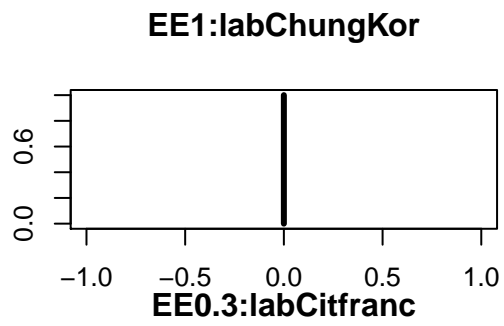
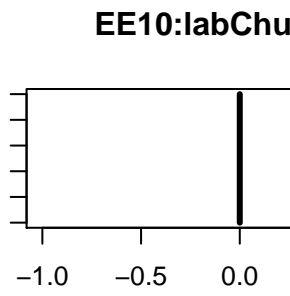
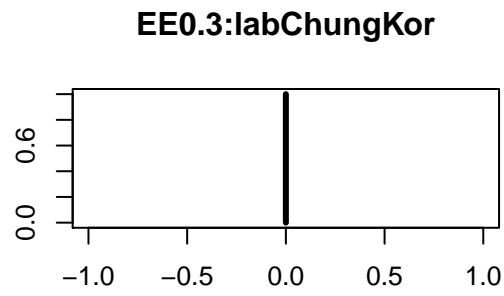
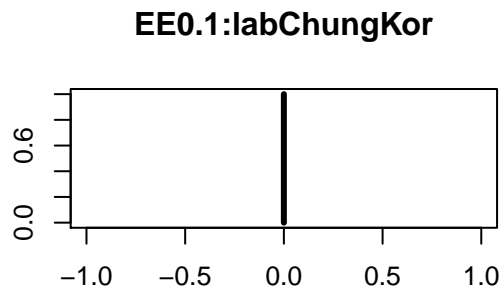


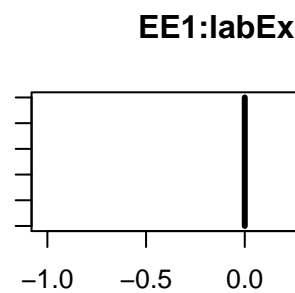
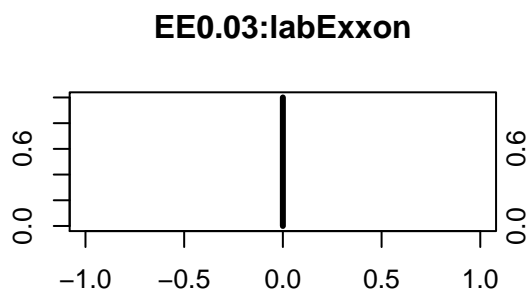
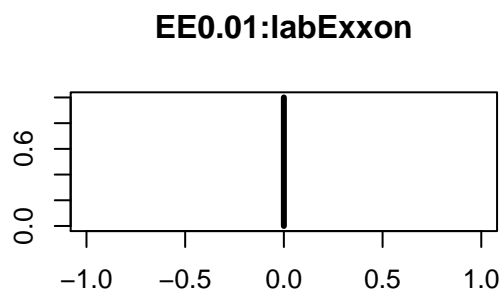
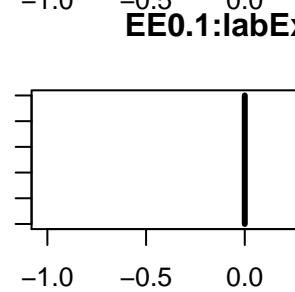
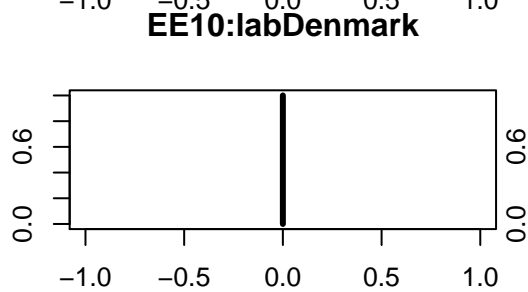
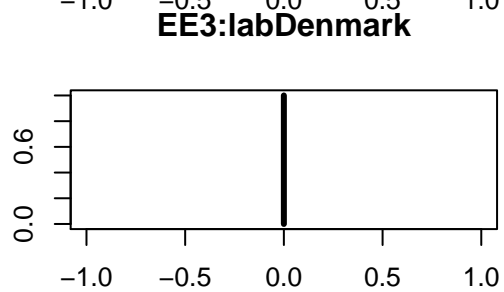
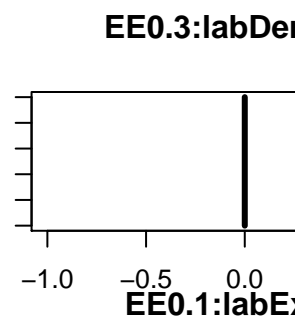
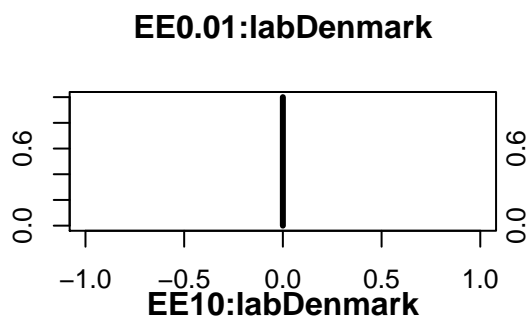
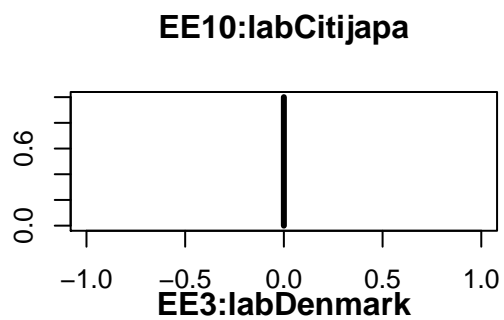
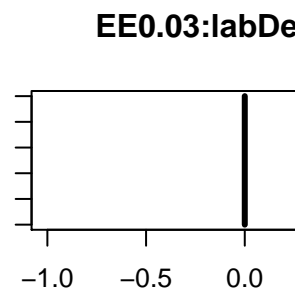
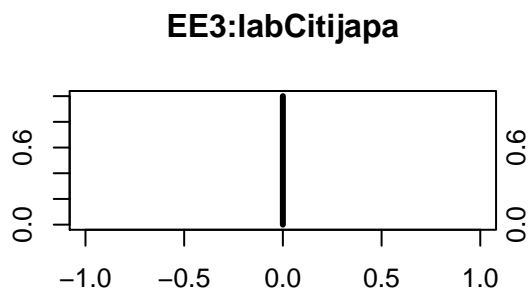
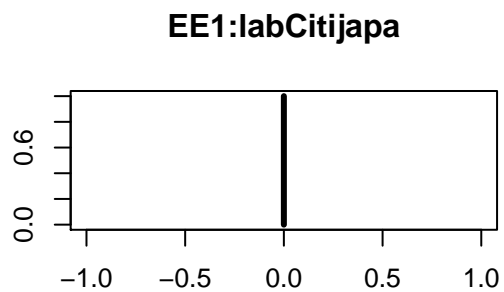
**ZM1**



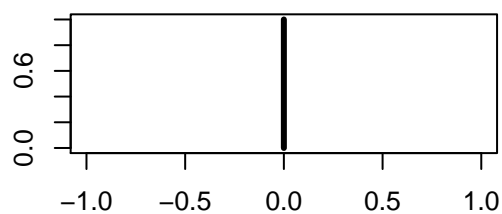




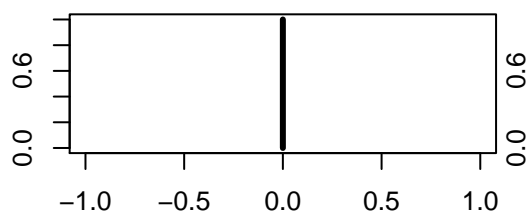




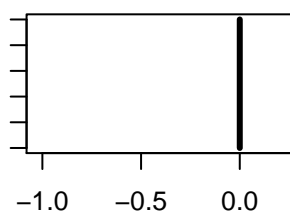
EE10:labExxon



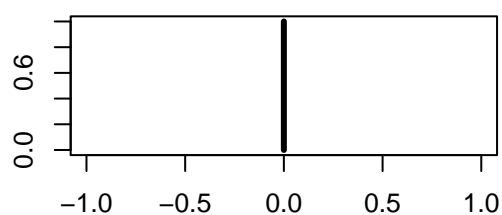
## EE0.01:labHatano



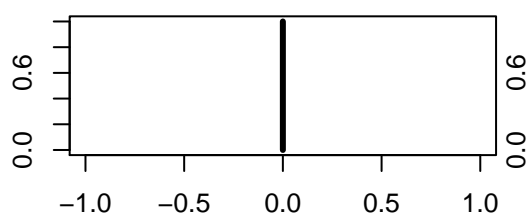
## EE0.3:labHa



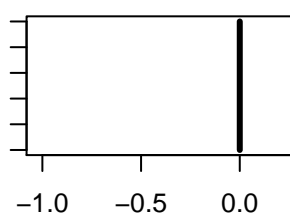
EE0.03:labHatano



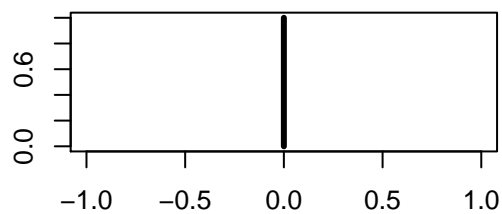
## EE0.1:labHatano



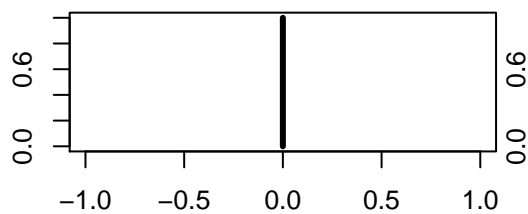
EE3:labHat



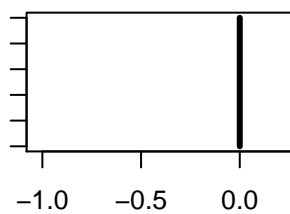
**EE0.01:labHuntingd**



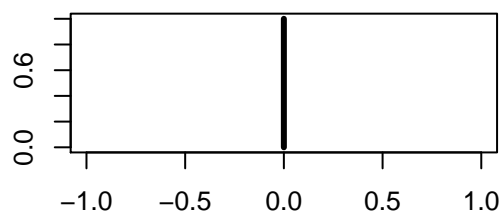
### EE0.03:labHuntingd



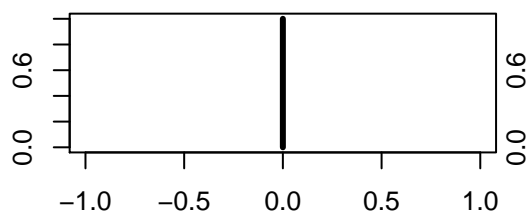
**EE1:labHun**



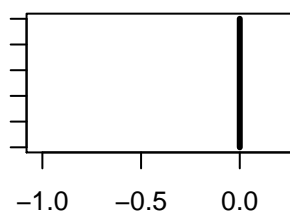
## EE0.1:labHuntingd

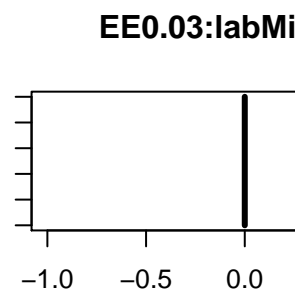
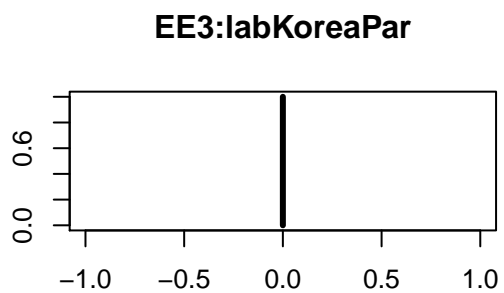
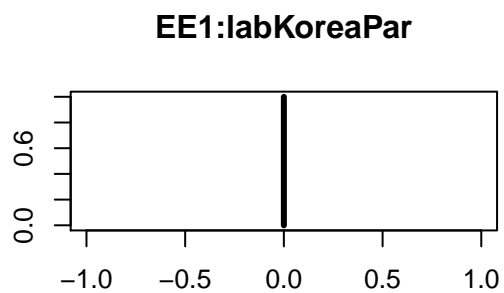
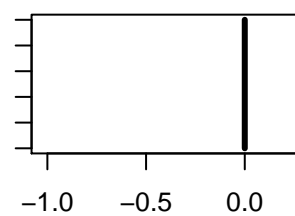
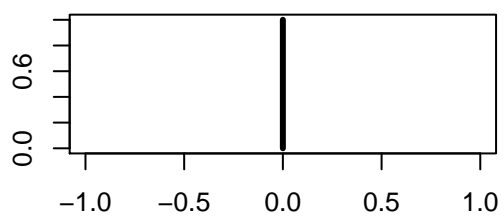
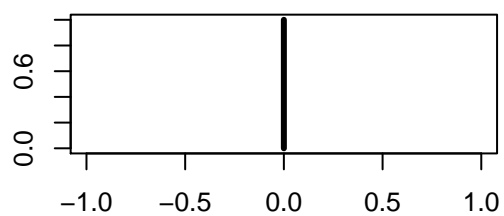
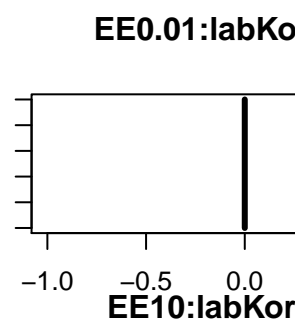
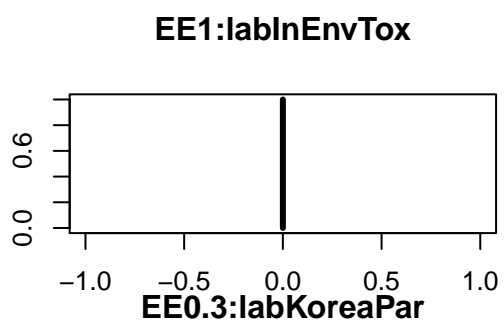
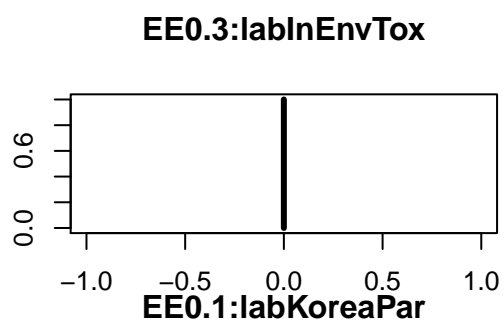
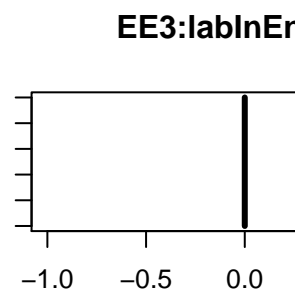
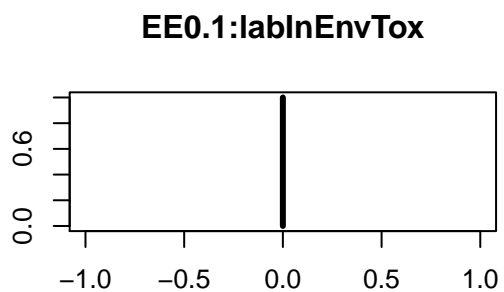
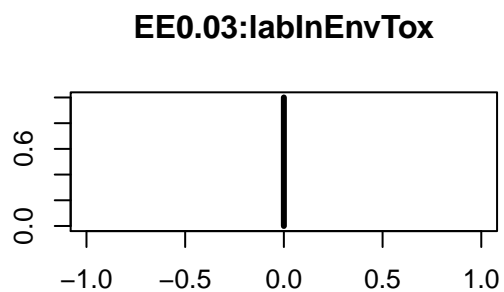


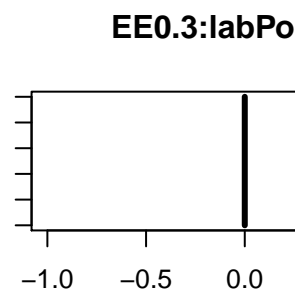
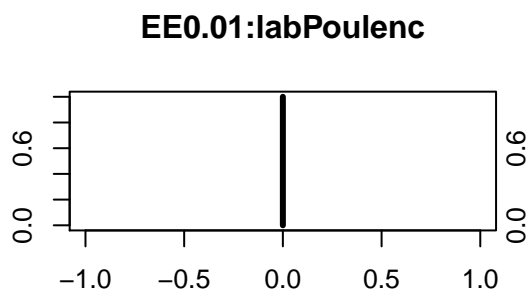
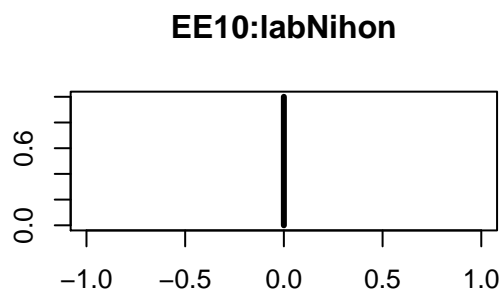
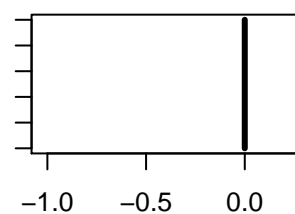
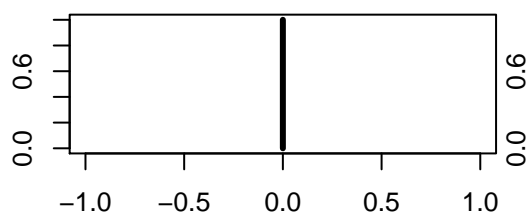
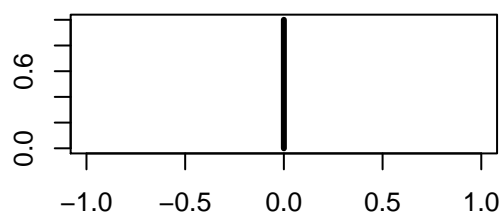
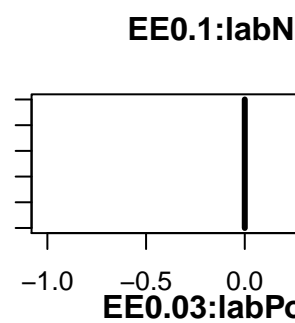
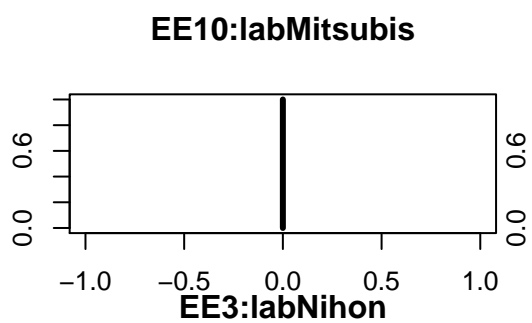
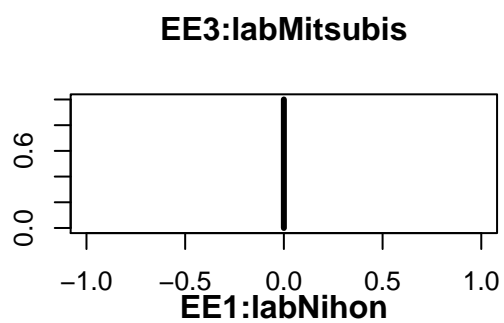
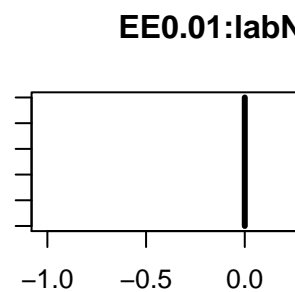
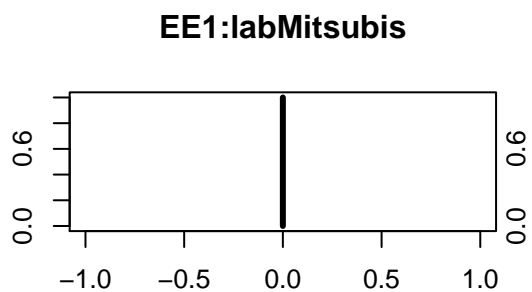
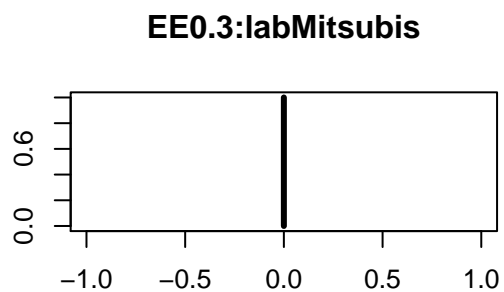
## EE0.3:labHuntingd

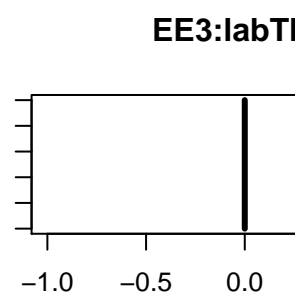
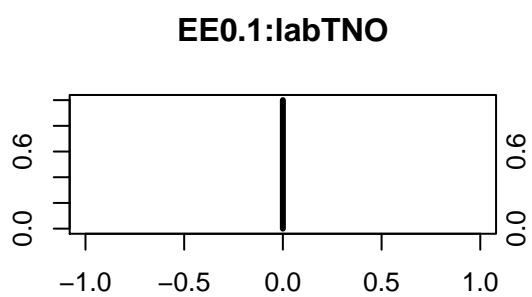
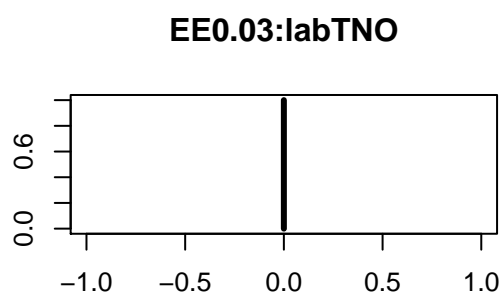
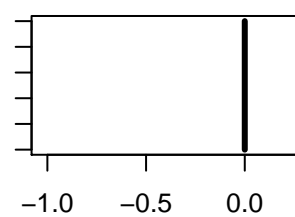
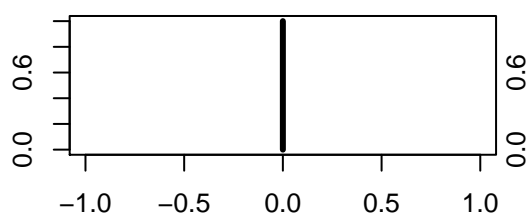
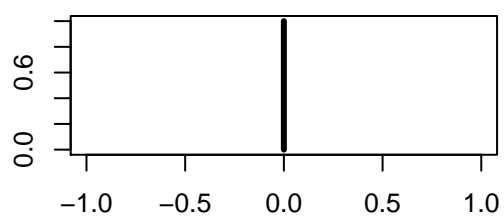
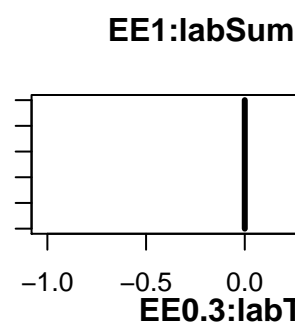
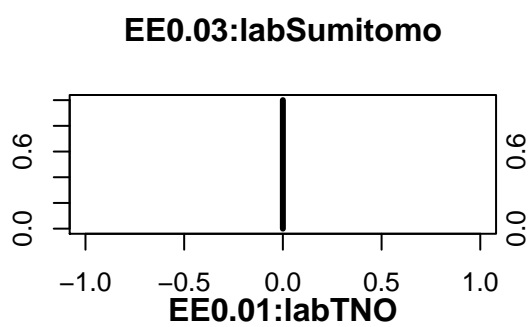
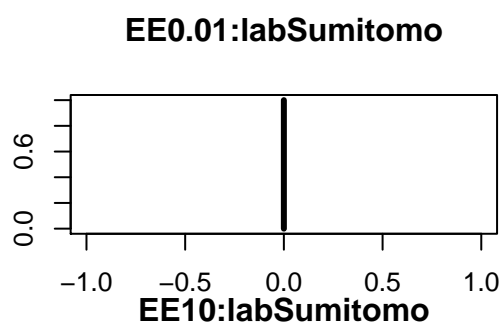
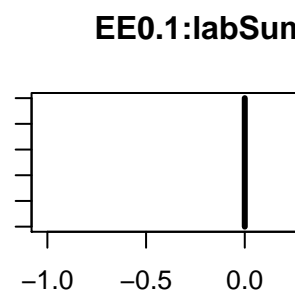
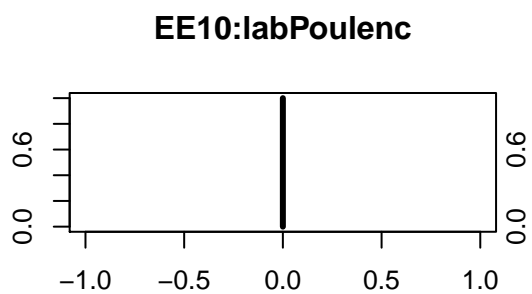
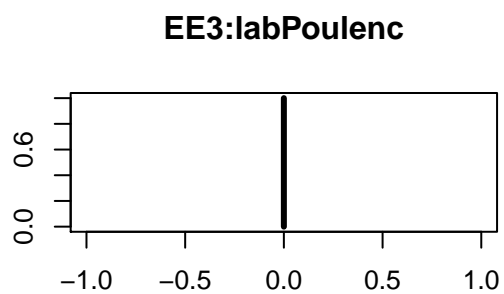


EE10:labHur

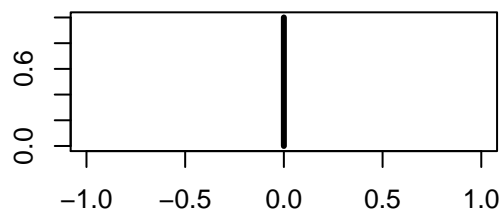




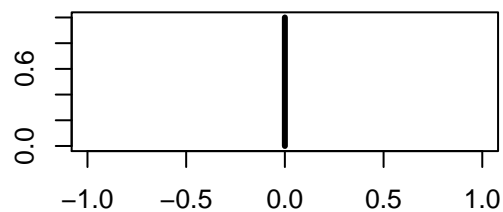




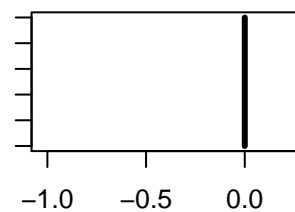
**EE0.01:labWIL**



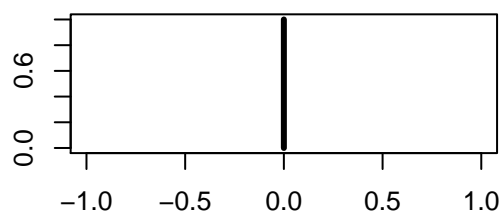
**EE0.03:labWIL**



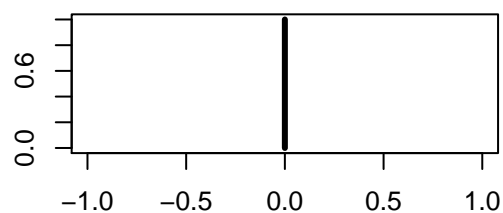
**EE1:labWIL**



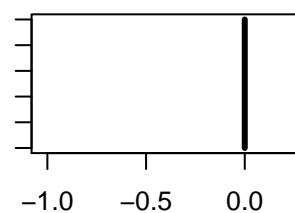
**EE0.1:labWIL**



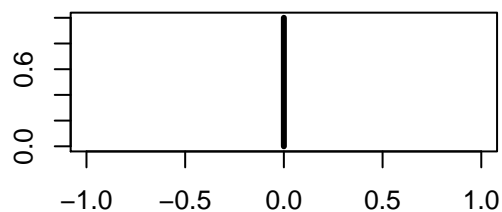
**EE0.3:labWIL**



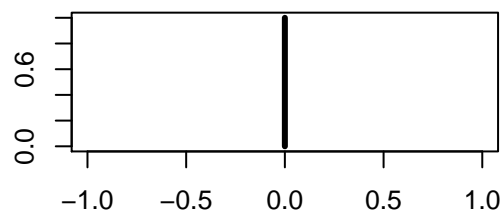
**EE10:labWIL**



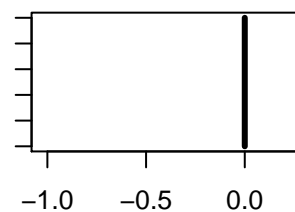
**EE0.03:labZeneca**



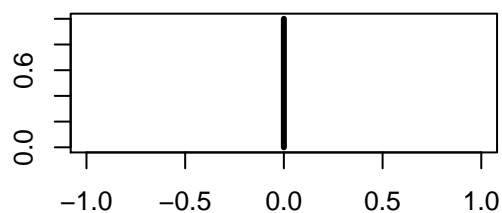
**EE0.1:labZeneca**



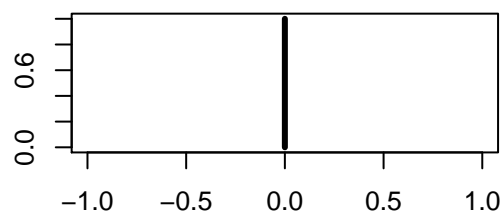
**EE3:labZeneca**



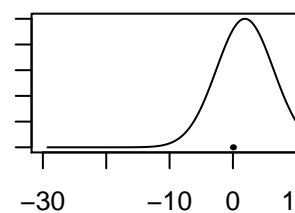
**EE0.3:labZeneca**



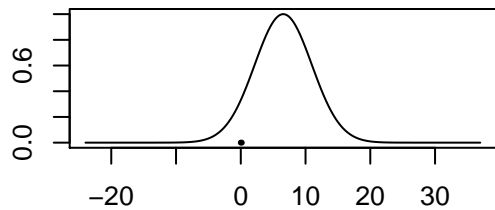
**EE1:labZeneca**



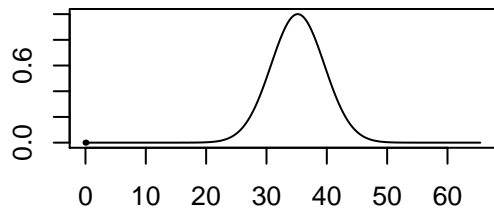
**EE0.01:prot**



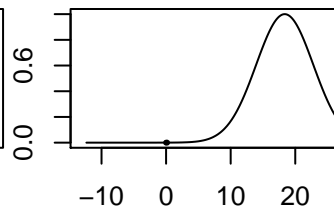
**EE0.1:protocolB**



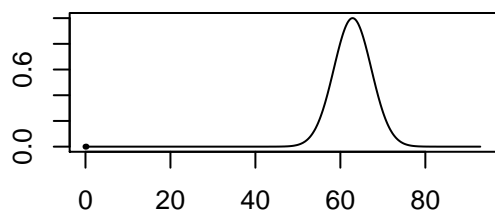
**EE0.3:protocolB**



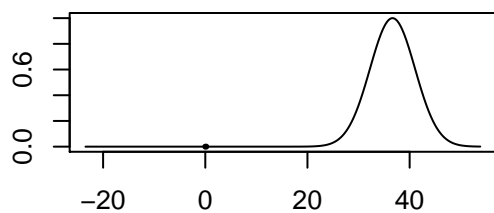
**EE10:proto**



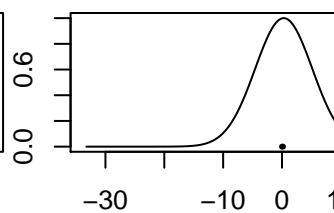
**EE1:protocolB**



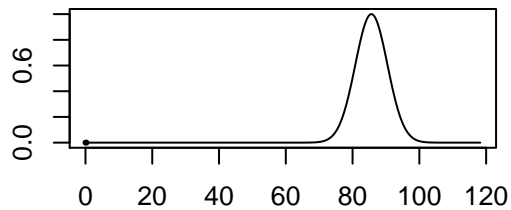
**EE3:protocolB**



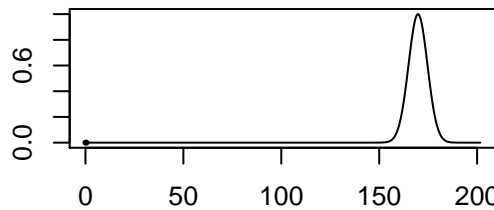
**EE0.03:proto**



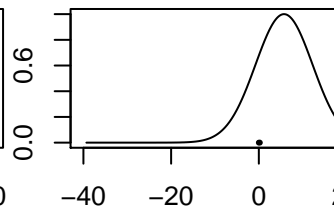
**EE0.3:protocolC**



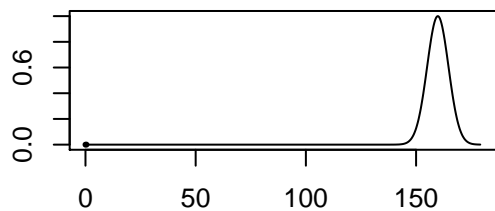
**EE1:protocolC**



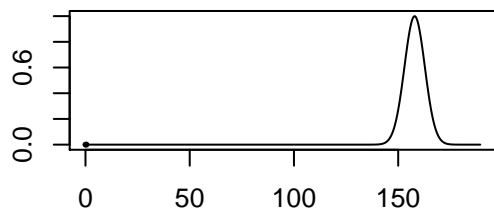
**EE0.01:proto**



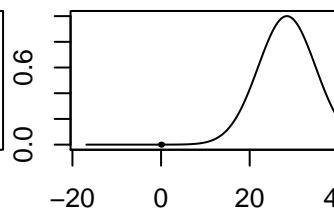
**EE3:protocolC**



**EE10:protocolC**

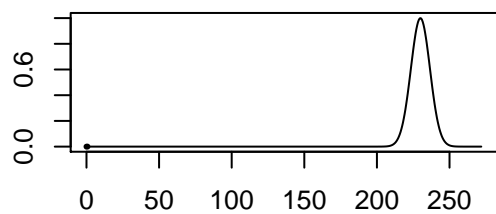


**EE0.1:proto**

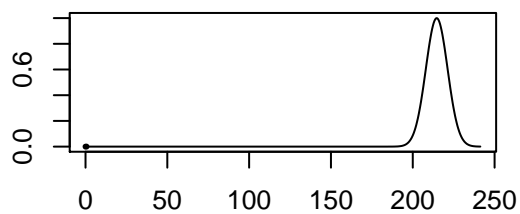




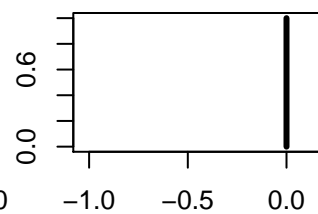
**EE1:protocolD**



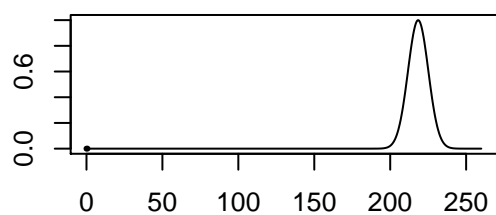
**EE3:protocolD**



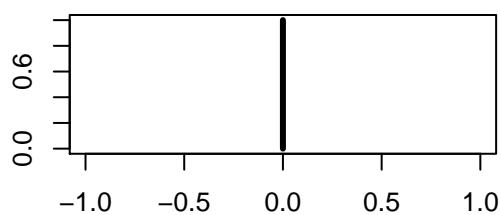
**labBerlin:ZM0.1**



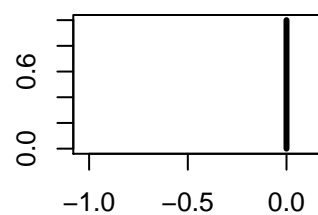
**EE10:protocolD**



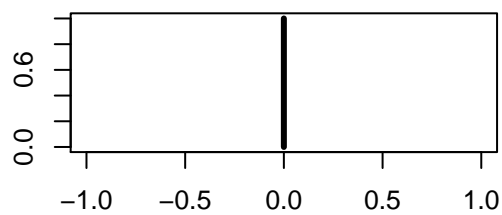
**labBayer:ZM0.1**



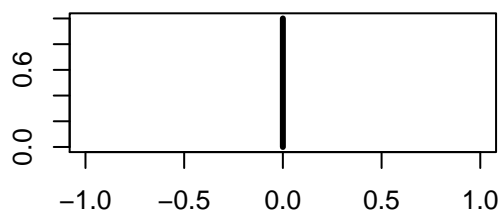
**labCitfranco:ZM0.1**



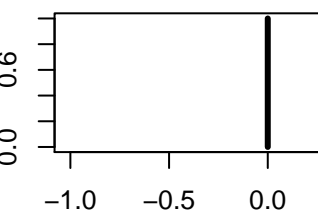
**labDenmark:ZM0.1**



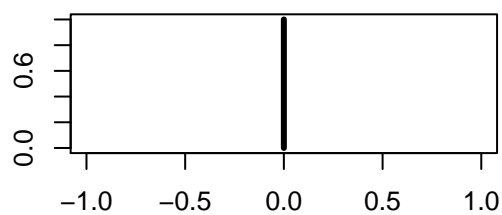
**labExxon:ZM0.1**



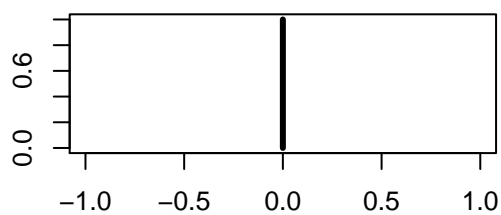
**labInEnvToxic:ZM0.1**



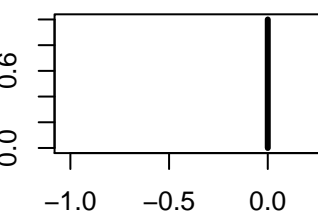
**labHatano:ZM0.1**

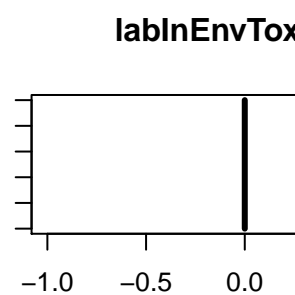
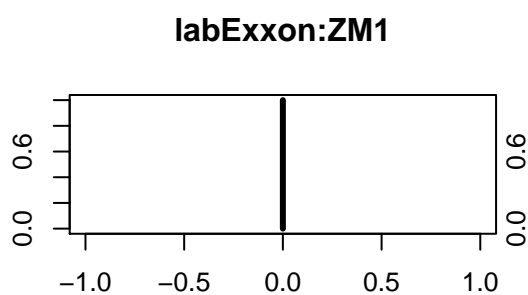
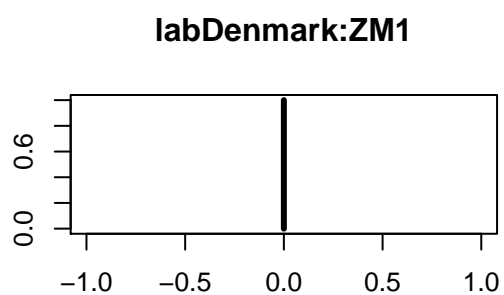
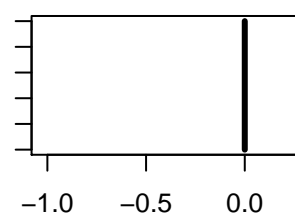
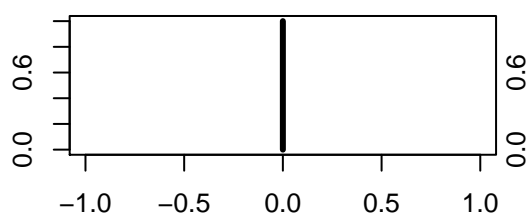
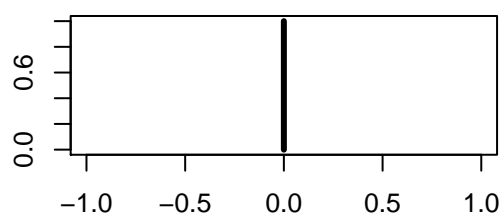
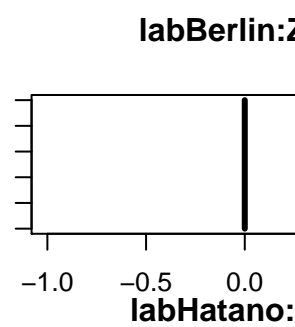
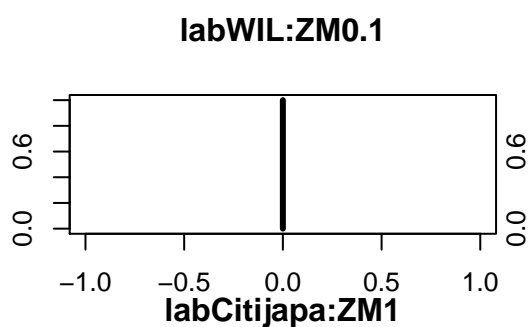
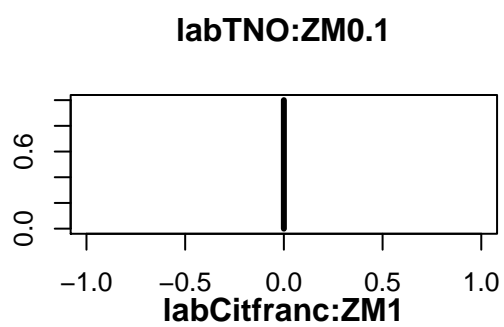
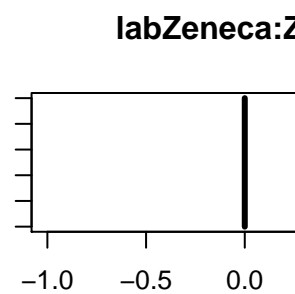
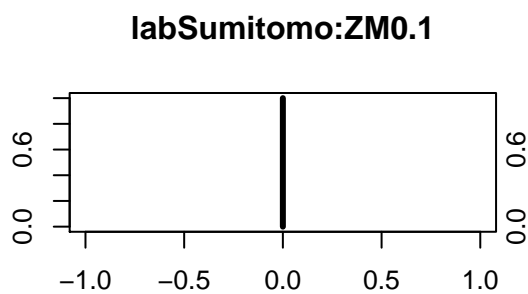
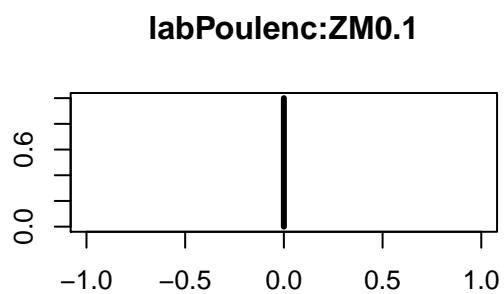


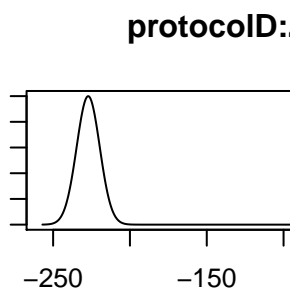
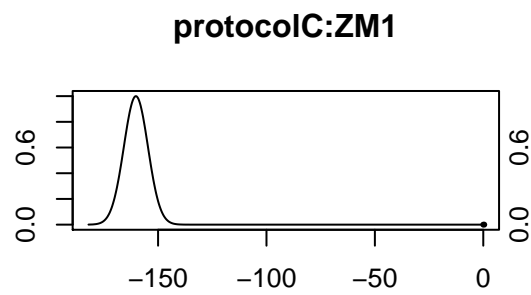
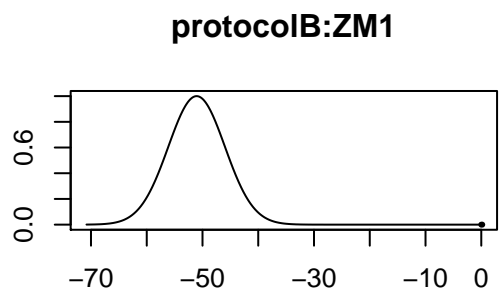
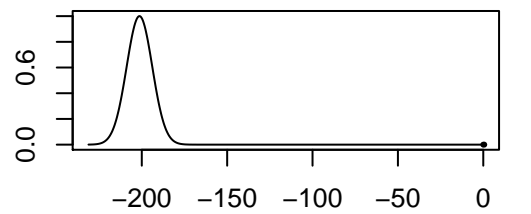
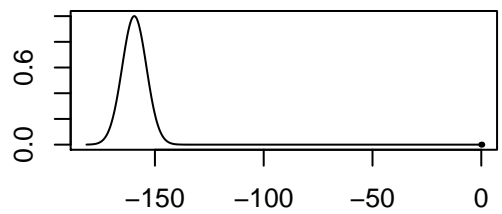
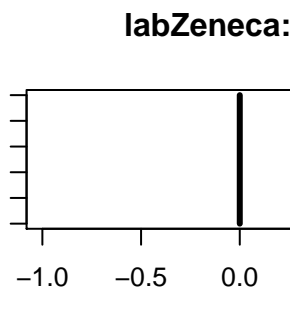
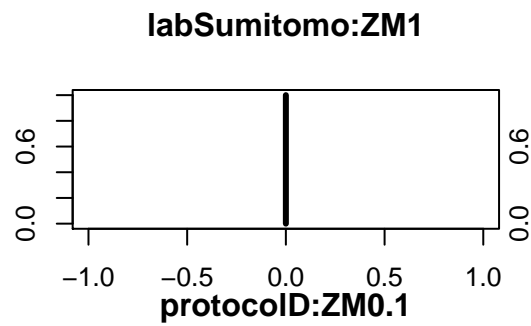
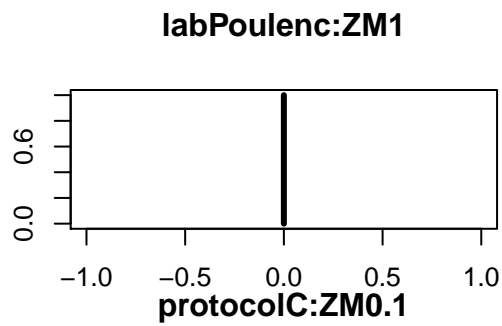
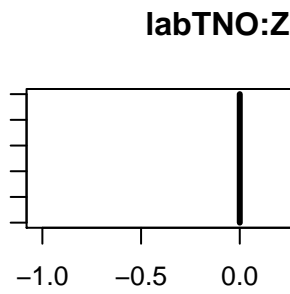
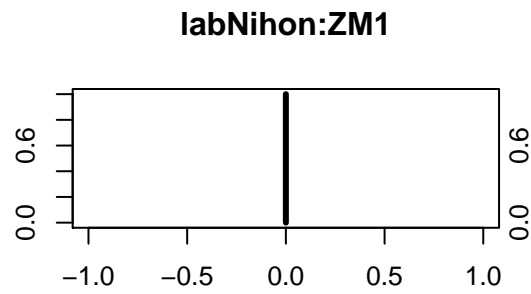
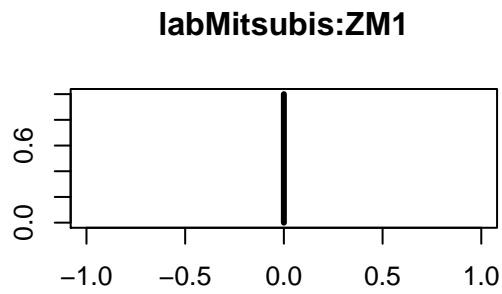
**labHuntingd:ZM0.1**



**labMitsubishi:ZM0.1**







b.

Does the dose response vary across labs? If so, are there certain labs that stand out as being different?

See figures in a.

c.

Do the protocols differ in their sensitivity to detecting estrogenic and anti-estrogenic effects? If so, is there one protocol that can be recommended?

```
confint(coef(bas1))
```

| ##                    | 2.5%        | 97.5%       | beta         |
|-----------------------|-------------|-------------|--------------|
| ## Intercept          | 99.9634854  | 101.7486490 | 100.82851700 |
| ## EE0.01             | -7.0899102  | 5.0961915   | -1.18653174  |
| ## EE0.03             | -6.3461745  | 5.5339375   | -0.59179098  |
| ## EE0.1              | -3.8796458  | 7.7245088   | 1.72987554   |
| ## EE0.3              | 0.3270019   | 11.9424794  | 5.94190996   |
| ## EE1                | 23.9758790  | 35.5834545  | 29.58700766  |
| ## EE3                | 65.5977553  | 77.2026835  | 71.63907237  |
| ## EE10               | 85.7773087  | 97.3814196  | 91.82098640  |
| ## labBayer           | 4.2265969   | 21.7968569  | 12.90273900  |
| ## labBerlin          | 14.8207481  | 31.7939841  | 23.63907831  |
| ## labChungKor        | 26.7229829  | 41.4198436  | 34.24246334  |
| ## labCitfranc        | 15.3480654  | 31.8894843  | 23.96033309  |
| ## labCitijapa        | 14.6792670  | 28.7011993  | 21.77222388  |
| ## labDenmark         | 11.8219810  | 29.0851938  | 20.53175514  |
| ## labExxon           | 14.7209057  | 31.6646678  | 23.53503627  |
| ## labHatano          | 15.5268897  | 29.3054604  | 22.33364563  |
| ## labHuntingd        | -49.5120607 | -27.2976560 | -38.74951798 |
| ## labInEnvTox        | 4.6209741   | 19.1197913  | 11.88291481  |
| ## labKoreaPar        | -5.2710045  | 10.0851675  | 2.31774371   |
| ## labMitsubis        | 13.2919192  | 27.0650258  | 20.06907414  |
| ## labNihon           | 6.7580996   | 20.4847438  | 13.70687247  |
| ## labPoulenc         | -7.9649679  | 8.7278134   | 0.34770812   |
| ## labSumitomo        | 20.4358141  | 34.4898450  | 27.68806203  |
| ## labTNO             | 14.6870243  | 29.6334401  | 22.11022279  |
| ## labWIL             | 4.5981485   | 19.3121859  | 12.15273474  |
| ## labZeneca          | -2.4314837  | 12.2201105  | 4.76057607   |
| ## protocolB          | -8.6001854  | 1.9465593   | -3.50007354  |
| ## protocolC          | 54.3364385  | 83.9884834  | 70.77908012  |
| ## protocolD          | 39.1949594  | 73.3408090  | 57.68268776  |
| ## ZM0.1              | -16.0812550 | -2.7880643  | -9.64511839  |
| ## ZM1                | -62.7020795 | -49.3943017 | -55.77804887 |
| ## weight             | 0.0000000   | 0.1301594   | 0.04618206   |
| ## EE0.01:labBayer    | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE0.03:labBayer    | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE0.1:labBayer     | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE0.3:labBayer     | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE1:labBayer       | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE3:labBayer       | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE10:labBayer      | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE0.01:labBerlin   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE0.03:labBerlin   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE0.1:labBerlin    | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE0.3:labBerlin    | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE1:labBerlin      | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE3:labBerlin      | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE10:labBerlin     | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE0.01:labChungKor | 0.0000000   | 0.0000000   | 0.00000000   |

|                       |           |           |            |
|-----------------------|-----------|-----------|------------|
| ## EE0.03:labChungKor | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labChungKor  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labChungKor  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labChungKor    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labChungKor    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labChungKor   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labCitfranc | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labCitfranc | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labCitfranc  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labCitfranc  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labCitfranc    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labCitfranc    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labCitfranc   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labCitijapa | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labCitijapa | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labCitijapa  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labCitijapa  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labCitijapa    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labCitijapa    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labCitijapa   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labDenmark  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labDenmark  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labDenmark   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labDenmark   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labDenmark     | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labDenmark     | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labDenmark    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labExxon    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labExxon    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labExxon     | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labExxon     | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labExxon       | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labExxon       | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labExxon      | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labHatano   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labHatano   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labHatano    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labHatano    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labHatano      | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labHatano      | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labHatano     | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labHuntingd | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labHuntingd | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labHuntingd  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labHuntingd  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labHuntingd    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labHuntingd    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labHuntingd   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labInEnvTox | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labInEnvTox | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labInEnvTox  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labInEnvTox  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labInEnvTox    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labInEnvTox    | 0.0000000 | 0.0000000 | 0.00000000 |

|                       |           |           |            |
|-----------------------|-----------|-----------|------------|
| ## EE10:labInEnvTox   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labKoreaPar | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labKoreaPar | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labKoreaPar  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labKoreaPar  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labKoreaPar    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labKoreaPar    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labKoreaPar   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labMitsubis | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labMitsubis | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labMitsubis  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labMitsubis  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labMitsubis    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labMitsubis    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labMitsubis   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labNihon    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labNihon    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labNihon     | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labNihon     | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labNihon       | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labNihon       | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labNihon      | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labPoulenc  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labPoulenc  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labPoulenc   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labPoulenc   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labPoulenc     | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labPoulenc     | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labPoulenc    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labSumitomo | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labSumitomo | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labSumitomo  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labSumitomo  | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labSumitomo    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labSumitomo    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labSumitomo   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labTNO      | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labTNO      | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labTNO       | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labTNO       | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labTNO         | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labTNO         | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labTNO        | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labWIL      | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labWIL      | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labWIL       | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labWIL       | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE1:labWIL         | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE3:labWIL         | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE10:labWIL        | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.01:labZeneca   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.03:labZeneca   | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.1:labZeneca    | 0.0000000 | 0.0000000 | 0.00000000 |
| ## EE0.3:labZeneca    | 0.0000000 | 0.0000000 | 0.00000000 |

|                      |             |             |              |
|----------------------|-------------|-------------|--------------|
| ## EE1:labZeneca     | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE3:labZeneca     | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE10:labZeneca    | 0.0000000   | 0.0000000   | 0.00000000   |
| ## EE0.01:protocolB  | -6.8298775  | 11.2127205  | 1.89630560   |
| ## EE0.03:protocolB  | -6.2774906  | 11.5567282  | 2.34409878   |
| ## EE0.1:protocolB   | -1.9741129  | 15.6790387  | 6.55911454   |
| ## EE0.3:protocolB   | 26.6466198  | 44.2945637  | 35.17766721  |
| ## EE1:protocolB     | 53.6872517  | 71.3468552  | 62.87308783  |
| ## EE3:protocolB     | 28.1080112  | 45.7478983  | 36.64803171  |
| ## EE10:protocolB    | 9.1593308   | 26.8661141  | 18.36769331  |
| ## EE0.01:protocolC  | -8.4968402  | 11.0994709  | 1.01031579   |
| ## EE0.03:protocolC  | -9.1114635  | 10.2959307  | 0.28941203   |
| ## EE0.1:protocolC   | -0.3148082  | 18.9164995  | 9.68541798   |
| ## EE0.3:protocolC   | 75.6113868  | 94.8380853  | 85.63123600  |
| ## EE1:protocolC     | 160.0832794 | 179.2972867 | 169.80766748 |
| ## EE3:protocolC     | 149.9611168 | 169.2482099 | 159.85569811 |
| ## EE10:protocolC    | 148.3581071 | 167.7779765 | 157.89403523 |
| ## EE0.01:protocolD  | -6.8552173  | 19.2104120  | 5.74642392   |
| ## EE0.03:protocolD  | -11.5420525 | 14.6548057  | 2.11132584   |
| ## EE0.1:protocolD   | 15.3595247  | 41.1041122  | 28.39008031  |
| ## EE0.3:protocolD   | 123.2493610 | 149.0722732 | 136.46645520 |
| ## EE1:protocolD     | 217.1209210 | 243.2373794 | 229.96046349 |
| ## EE3:protocolD     | 202.0149067 | 228.2972836 | 214.63658437 |
| ## EE10:protocolD    | 204.6610155 | 231.1203307 | 218.42965678 |
| ## labBayer:ZM0.1    | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labBerlin:ZM0.1   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labChungKor:ZM0.1 | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labCitfranc:ZM0.1 | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labCitijapa:ZM0.1 | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labDenmark:ZM0.1  | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labExxon:ZM0.1    | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labHatano:ZM0.1   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labHuntingd:ZM0.1 | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labInEnvTox:ZM0.1 | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labKoreaPar:ZM0.1 | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labMitsubis:ZM0.1 | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labNihon:ZM0.1    | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labPoulenc:ZM0.1  | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labSumitomo:ZM0.1 | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labTNO:ZM0.1      | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labWIL:ZM0.1      | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labZeneca:ZM0.1   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labBayer:ZM1      | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labBerlin:ZM1     | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labChungKor:ZM1   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labCitfranc:ZM1   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labCitijapa:ZM1   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labDenmark:ZM1    | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labExxon:ZM1      | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labHatano:ZM1     | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labHuntingd:ZM1   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labInEnvTox:ZM1   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labKoreaPar:ZM1   | 0.0000000   | 0.0000000   | 0.00000000   |
| ## labMitsubis:ZM1   | 0.0000000   | 0.0000000   | 0.00000000   |

```
## labNihon:ZM1      0.0000000  0.0000000  0.0000000
## labPoulenc:ZM1    0.0000000  0.0000000  0.0000000
## labSumitomo:ZM1   0.0000000  0.0000000  0.0000000
## labTNO:ZM1        0.0000000  0.0000000  0.0000000
## labWIL:ZM1        0.0000000  0.0000000  0.0000000
## labZeneca:ZM1     0.0000000  0.0000000  0.0000000
## protocolB:ZM0.1   -70.7834959 -50.4822149 -60.94975534
## protocolC:ZM0.1   -170.5569762 -148.3006501 -159.48332372
## protocolD:ZM0.1   -216.7123817 -186.6814970 -201.36040286
## protocolB:ZM1      -60.8828434 -40.5809578 -51.05086720
## protocolC:ZM1      -171.3012343 -149.1127288 -160.23005583
## protocolD:ZM1      -242.4823897 -212.4619059 -227.16534815
## attr("Probability")
## [1] 0.95
## attr("class")
## [1] "confint.bas"
```

## Model Part III

```
## X matrix and scale
X0 = model.matrix(lm.full)[-1]
X.scaled = scale(X0)/sqrt(n-1)

## data for jags
data = list(Y = bioassay$uterus, X = X.scaled, p = p, n = n)
data$scales = attr(X.scaled, "scaled:scale")*sqrt(n-1) + 0.00001
data$Xbar = attr(X.scaled, "scaled:center")

## JAGS
rr.model = function() {
  a <- 2
  shape <- a/2

  for (i in 1:n) {
    mu[i] <- alpha0 + inprod(X[i,], alpha)
    Y[i] ~ dnorm(0, phi)
  }
  phi ~ dgamma(1.0E-6, 1.0E-6) ##jags do not allow improper prior
  alpha0 ~ dnorm(0, 1.0E-6)

  for (j in 1:p) {
    phi.l[j] <- pow(i.phi.l[j], -2)
    prec.beta[j] <- lambda.l[j]*phi*phi.l[j]
    alpha[j] ~ dnorm(0, prec.beta[j])
    # transform back to original coefficients
    beta[j] <- alpha[j]/scales[j]
    lambda.l[j] ~ dgamma(shape, shape)
    i.phi.l[j] ~ dt(0,1,1)%_T(0,)
  }

  # transform intercept to usual parameterization
  beta0 <- alpha0 - inprod(beta[1:p], Xbar)
```



```

    sigma <- pow(phi, -.5)
  }

  ## parameters to monitor
  parameters = c("beta0", "beta", "sigma", "lambda.l", "phi.l")

  ## run jags
  jags.result = jags(data, inits=NULL, par=parameters,
                    model=rr.model, n.iter=30000)

  ## module glm loaded

  ## Compiling model graph
  ##   Resolving undeclared variables
  ##   Allocating nodes
  ## Graph information:
  ##   Observed stochastic nodes: 2677
  ##   Unobserved stochastic nodes: 662
  ##   Total graph size: 601326
  ##
  ## Initializing model

  saveRDS(jags.result, "jags.result.rds")
  jags.result=readRDS("jags.result.rds")

```

a.

Is the uterotrophic bioassay successful overall at identifying estrogenic effects of EE and anti- estrogenic effects of ZM? Do some labs fail to detect such effects? At what dose level of EE is there a change relative to the control and does this level vary across labs?

```
jags.mcmc = as.mcmc(jags.result$BUGSoutput$sims.matrix)
```

b.

Does the dose response vary across labs? If so, are there certain labs that stand out as being different?

See figures in a.

c.

Do the protocols differ in their sensitivity to detecting estrogenic and anti-estrogenic effects? If so, is there one protocol that can be recommended?