Analysis of Gene Expression

Transcriptional signature of prion-induced neurotoxicity in a Drosophila model of transmissible mammalian prion disease

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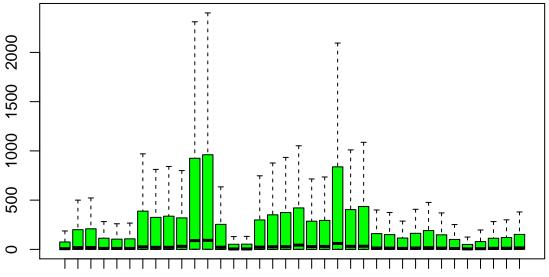
setwd("/home/nieks/Documents/Bio-Informatica/Thema 07 - Analyse van Genexpressie/Praktijkopdracht")
data <- read.table("Data/GSE144028.txt")</pre>

summary(data)

```
##
    X51D_30_NBH_1
                        X51D_30_NBH_2
                                            X51D_30_NBH_3
                                                                  X51D_30_S_1
##
    Min.
                    0
                        Min.
                                        0
                                            Min.
                                                            0
                                                                                0
                                                                 Min.
                                                                                0
##
    1st Qu.:
                    0
                        1st Qu.:
                                        0
                                            1st Qu.:
                                                            0
                                                                 1st Qu.:
##
    Median:
                    7
                        Median:
                                       18
                                            Median :
                                                                 Median:
                                                                               10
                                                           19
    Mean
                 377
                        Mean
                                      972
                                            Mean
                                                         1030
                                                                 Mean
                                                                              568
                  75
                        3rd Qu.:
                                      200
                                                          209
##
    3rd Qu.:
                                            3rd Qu.:
                                                                 3rd Qu.:
                                                                              113
##
    Max.
            :3445037
                        Max.
                                :8342368
                                            Max.
                                                    :8875291
                                                                 Max.
                                                                        :5560520
##
     X51D_30_S_2
                         X51D_30_S_3
                                             X51D_5_NBH_1
                                                                  X51D_5_NBH_2
    Min.
                    0
                        Min.
                                            Min.
                                                                 Min.
##
    1st Qu.:
                    0
                        1st Qu.:
                                        0
                                            1st Qu.:
                                                            0
                                                                 1st Qu.:
                                                                                0.0
                   10
                                       10
                                            Median :
                                                                 Median:
                                                                               21.0
##
    Median :
                        Median:
                                                           26
##
    Mean
                 480
                                      509
                                            Mean
                                                          869
                                                                 Mean
                                                                              688.3
                        Mean
                        3rd Qu.:
                                            3rd Qu.:
                                                                 3rd Qu.:
##
    3rd Qu.:
                 104
                                      107
                                                          388
                                                                              325.0
                                                                        :2415360.0
##
    Max.
            :4122340
                        Max.
                                :4386825
                                            Max.
                                                    :3832490
                                                                 Max.
     X51D_5_NBH_3
                             X51D_5_S_1
                                                   X51D_5_S_2
                                                                       X51D 5 S 3
##
##
    Min.
                    0.0
                          Min.
                                          0.0
                                                 Min.
                                                                 0
                                                                     Min.
##
    1st Qu.:
                    0.0
                          1st Qu.:
                                          0.0
                                                 1st Qu.:
                                                                 1
                                                                     1st Qu.:
                                                                                     1
                                         31.0
                                                 Median:
                                                                     Median :
                                                                                    92
##
    Median:
                  21.5
                          Median:
                                                               89
##
    Mean
                 718.8
                                        722.4
                                                 Mean
                                                             1999
                                                                     Mean
                                                                                 2092
                          Mean
                                                                     3rd Qu.:
##
    3rd Qu.:
                 337.0
                          3rd Qu.:
                                        320.0
                                                 3rd Qu.:
                                                              925
                                                                                  961
            :2533918.0
                                                                             :7625567
                                   :3111359.0
##
    Max.
                          Max.
                                                 Max.
                                                         :7272134
                                                                     Max.
    PrPCyt 30 NBH 1
                        PrPCyt_30_NBH_2
                                               PrPCyt_30_NBH_3
                                                                     PrPCyt_30_S_1
##
    Min.
                    0
                        Min.
                                        0.0
                                              Min.
                                                              0.0
                                                                     Min.
##
    1st Qu.:
                    0
                        1st Qu.:
                                        0.0
                                               1st Qu.:
                                                              0.0
                                                                     1st Qu.:
                                                                                     0
                                        4.0
                                                              4.0
##
    Median :
                  22
                        Median:
                                               Median:
                                                                     Median :
                                                                                    23
##
    Mean
                 855
                                      176.5
                                                            181.1
                                                                     Mean
                                                                                  793
                        Mean
                                               Mean
                                               3rd Qu.:
##
    3rd Qu.:
                 254
                        3rd Qu.:
                                       52.0
                                                             53.0
                                                                     3rd Qu.:
                                                                                   299
    Max.
            :5261726
                        Max.
                                :1059586.0
                                               Max.
                                                       :1096115.0
                                                                     Max.
                                                                             :4058764
                        PrPCyt_30_S_3
                                            PrPCyt_5_NBH_1
##
    PrPCyt_30_S_2
                                                                 PrPCyt_5_NBH_2
                    0
                                        0
##
    Min.
            :
                        Min.
                                            Min.
                                                            0
                                                                 Min.
                                                                                0.0
                                                                                0.0
##
                    0
                                        0
                                                            0
    1st Qu.:
                        1st Qu.:
                                            1st Qu.:
                                                                 1st Qu.:
    Median:
                  27
                        Median:
                                       28
                                            Median:
                                                           43
                                                                 Median:
                                                                               29.0
##
    Mean
                 857
                        Mean
                                      914
                                            Mean
                                                          828
                                                                 Mean
                                                                              591.5
    3rd Qu.:
                 351
                        3rd Qu.:
                                      374
                                            3rd Qu.:
                                                          421
                                                                 3rd Qu.:
                                                                              286.0
            :3769299
                                :4079216
                                                    :3163765
                                                                         :2692026.0
    Max.
                        Max.
                                            Max.
                                                                 Max.
```

```
PrPCyt_5_NBH_3
                           PrPCyt_5_S_1
                                              PrPCyt_5_S_2
##
                                                                    PrPCyt_5_S_3
##
                   0.0
                         Min.
                                         0
                                             Min.
                                                             0.0
                                                                   Min.
                                                                                  0.0
    Min.
           :
                                                     :
##
    1st Qu.:
                   0.0
                          1st Qu.:
                                         0
                                             1st Qu.:
                                                             0.0
                                                                   1st Qu.:
                                                                                  0.0
                                                                                 32.0
##
    {\tt Median} :
                  30.0
                          Median :
                                        60
                                             Median :
                                                           31.0
                                                                   Median:
##
    Mean
                 603.4
                          Mean
                                      1537
                                             Mean
                                                          764.7
                                                                   Mean
                                                                                821.5
##
    3rd Qu.:
                 294.0
                          3rd Qu.:
                                       838
                                             3rd Qu.:
                                                          403.8
                                                                   3rd Qu.:
                                                                                435.0
            :2734069.0
                                 :4603176
                                             Max.
                                                     :2386987.0
                                                                   Max.
                                                                           :2556960.0
##
    Max.
                          Max.
                         PrPGPI_40_NBH_2
                                             PrPGPI_40_NBH_3
                                                                  PrPGPI_40_S_1
##
    PrPGPI_40_NBH_1
##
    Min.
           :
                    0
                         Min.
                               :
                                         0
                                             Min.
                                                     :
                                                              0
                                                                  Min.
                                                                                  0
##
    1st Qu.:
                    0
                         1st Qu.:
                                         0
                                             1st Qu.:
                                                              0
                                                                  1st Qu.:
##
    Median :
                   14
                         Median :
                                        13
                                             Median:
                                                             10
                                                                  Median :
                                                                                 14
##
    Mean
                 1556
                         Mean
                                      1521
                                             Mean
                                                                  Mean
                                                                               1235
                                                          1116
    3rd Qu.:
                         3rd Qu.:
##
                  160
                                       150
                                             3rd Qu.:
                                                           115
                                                                  3rd Qu.:
                                                                                163
##
    Max.
            :18885278
                                 :18935887
                                                     :13407360
                                                                          :14289546
                         Max.
                                             Max.
                                                                  Max.
##
    PrPGPI_40_S_2
                         PrPGPI_40_S_3
                                            PrPGPI_5_NBH_1
                                                                 PrPGPI_5_NBH_2
##
    Min.
                    0
                         Min.
                                        0
                                            Min.
                                                             0
                                                                 Min.
                                                                                0
##
                    0
                                                             0
                                                                                0
    1st Qu.:
                         1st Qu.:
                                        0
                                            1st Qu.:
                                                                 1st Qu.:
##
    Median :
                   17
                         Median:
                                       13
                                            Median:
                                                             9
                                                                 Median:
                                                                                5
                         Mean
                                      979
                                                                 Mean
##
    Mean
                 1318
                                            Mean
                                                         1077
                                                                              629
##
    3rd Qu.:
                  191
                         3rd Qu.:
                                      148
                                            3rd Qu.:
                                                          101
                                                                 3rd Qu.:
                                                                               50
                                                    :11252267
##
    Max.
            :14709751
                         Max.
                                :9635362
                                            Max.
                                                                 Max.
                                                                         :6579166
##
    PrPGPI_5_NBH_3
                          PrPGPI_5_S_1
                                             PrPGPI_5_S_2
                                                                 PrPGPI_5_S_3
##
                    0
                                        0
                                                           0
                                                                               0
    Min.
                         Min.
                                :
                                            Min.
                                                                Min.
           :
                    0
                         1st Qu.:
                                        0
                                            1st Qu.:
                                                           0
                                                                1st Qu.:
                                                                               0
##
    1st Qu.:
##
    Median:
                    7
                         Median:
                                       11
                                            Median:
                                                          12
                                                                Median:
                                                                              15
##
    Mean
                  968
                         Mean
                                      793
                                            Mean
                                                         782
                                                                Mean
                                                                            1018
##
    3rd Qu.:
                   79
                         3rd Qu.:
                                      113
                                            3rd Qu.:
                                                         120
                                                                3rd Qu.:
                                                                             152
            :10120453
                                 :6111197
                                                    :6215874
                                                                        :7851434
    Max.
                         Max.
                                            Max.
                                                                Max.
```

boxplot((data), outline = FALSE, col = 'green')



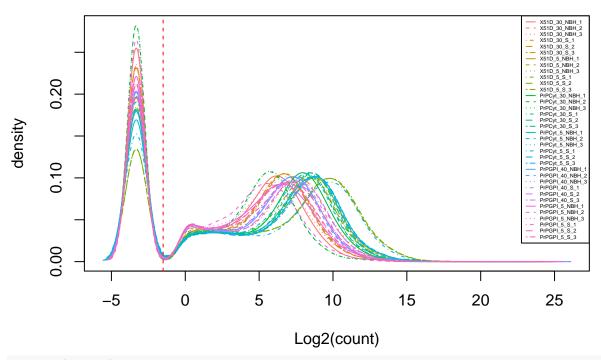
X51D_30_NBH_1 X51D_5_S_2 PrPCyt_5_NBH_3 PrPGPI_5_NBH_3

library(affy)

- ## Loading required package: BiocGenerics
- ## Loading required package: parallel

```
##
## Attaching package: 'BiocGenerics'
## The following objects are masked from 'package:parallel':
##
       clusterApply, clusterApplyLB, clusterCall, clusterEvalQ,
##
##
       clusterExport, clusterMap, parApply, parCapply, parLapply,
##
       parLapplyLB, parRapply, parSapply, parSapplyLB
## The following objects are masked from 'package:stats':
##
##
       IQR, mad, sd, var, xtabs
## The following objects are masked from 'package:base':
##
##
       anyDuplicated, append, as.data.frame, basename, cbind, colnames,
##
       dirname, do.call, duplicated, eval, evalq, Filter, Find, get, grep,
##
       grepl, intersect, is.unsorted, lapply, Map, mapply, match, mget,
##
       order, paste, pmax, pmax.int, pmin, pmin.int, Position, rank,
##
       rbind, Reduce, rownames, sapply, setdiff, sort, table, tapply,
       union, unique, unsplit, which.max, which.min
##
## Loading required package: Biobase
## Welcome to Bioconductor
##
##
       Vignettes contain introductory material; view with
       'browseVignettes()'. To cite Bioconductor, see
##
##
       'citation("Biobase")', and for packages 'citation("pkgname")'.
library(scales)
myColors <- hue_pal()(12)</pre>
plotDensity(log2(data + 0.1), col=rep(myColors, each=3),
            lty=c(1:ncol(data)), xlab="Log2(count)",
            main="Expression Distribution")
legend('topright', names(data), lty=c(1:ncol(data)),
       col=rep(myColors, each=3), cex=0.32)
abline(v=-1.5, lwd=1, col='red', lty=2)
```

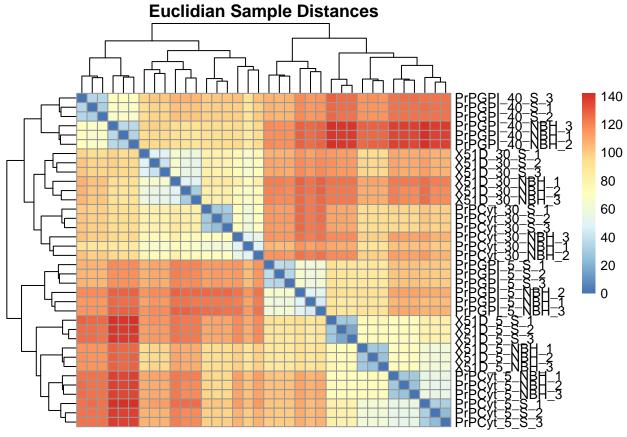
Expression Distribution



library(DESeq2)

```
## Loading required package: S4Vectors
## Loading required package: stats4
##
## Attaching package: 'S4Vectors'
## The following object is masked from 'package:base':
##
       expand.grid
##
## Loading required package: IRanges
## Loading required package: GenomicRanges
## Loading required package: GenomeInfoDb
## Loading required package: SummarizedExperiment
## Loading required package: MatrixGenerics
## Loading required package: matrixStats
##
## Attaching package: 'matrixStats'
## The following objects are masked from 'package:Biobase':
##
##
       anyMissing, rowMedians
## Attaching package: 'MatrixGenerics'
## The following objects are masked from 'package:matrixStats':
```

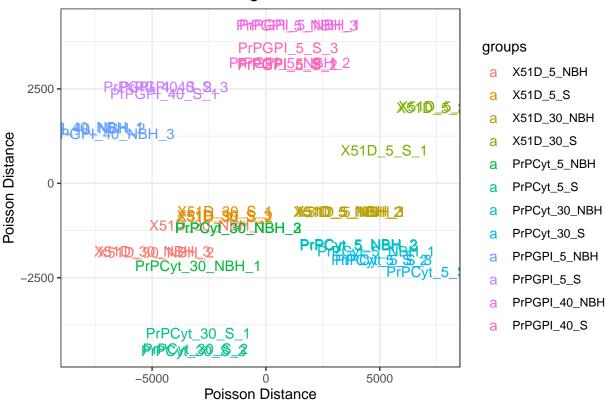
```
##
##
       colAlls, colAnyNAs, colAnys, colAvgsPerRowSet, colCollapse,
       colCounts, colCummaxs, colCummins, colCumprods, colCumsums,
##
       colDiffs, colIQRDiffs, colIQRs, colLogSumExps, colMadDiffs,
##
##
       colMads, colMaxs, colMeans2, colMedians, colMins, colOrderStats,
##
       colProds, colQuantiles, colRanges, colRanks, colSdDiffs, colSds,
##
       colSums2, colTabulates, colVarDiffs, colVars, colWeightedMads,
##
       colWeightedMeans, colWeightedMedians, colWeightedSds,
##
       colWeightedVars, rowAlls, rowAnyNAs, rowAnys, rowAvgsPerColSet,
##
       rowCollapse, rowCounts, rowCummaxs, rowCummins, rowCumprods,
##
       rowCumsums, rowDiffs, rowIQRDiffs, rowIQRs, rowLogSumExps,
       rowMadDiffs, rowMads, rowMaxs, rowMeans2, rowMedians, rowMins,
##
##
       rowOrderStats, rowProds, rowQuantiles, rowRanges, rowRanks,
##
       rowSdDiffs, rowSds, rowSums2, rowTabulates, rowVarDiffs, rowVars,
##
       rowWeightedMads, rowWeightedMeans, rowWeightedMedians,
##
       rowWeightedSds, rowWeightedVars
## The following object is masked from 'package:Biobase':
##
       rowMedians
(ddsMat <- DESeqDataSetFromMatrix(countData = data,</pre>
                                   colData = data.frame(samples = names(data)),
                                   design = ~1))
## class: DESeqDataSet
## dim: 17742 36
## metadata(1): version
## assays(1): counts
## rownames(17742): FBgn0000003 FBgn0000008 ... __not_aligned
     __too_low_aQual
## rowData names(0):
## colnames(36): X51D_30_NBH_1 X51D_30_NBH_2 ... PrPGPI_5_S_2 PrPGPI_5_S_3
## colData names(1): samples
rld.dds <- vst(ddsMat)</pre>
rld <- assay(rld.dds)</pre>
sampledists <- dist( t( rld ))</pre>
library(pheatmap)
sampleDistMatrix <- as.matrix(sampledists)</pre>
annotation <- data.frame(Type = factor(rep(rep(1:2, each = 3), each = 6),
                                           labels = c("Normal Brain Homogenate", "Scrapie")))
rownames(annotation) <- names(counts)</pre>
pheatmap(sampleDistMatrix, show_colnames = FALSE,
         # annotation col = annotation, # Gives an error
         clustering distance rows = sampledists,
         clustering_distance_cols = sampledists,
         main = "Euclidian Sample Distances")
```



```
library(PoiClaClu)
library(ggplot2)
dds <- assay(ddsMat)</pre>
poisd <- PoissonDistance( t(dds) )</pre>
samplePoisDistMatrix <- as.matrix(poisd$dd)</pre>
mdsPoisData <- data.frame( cmdscale(samplePoisDistMatrix) )</pre>
names(mdsPoisData) <- c('x_coord', 'y_coord')</pre>
groups <- factor(rep(1:12, each=3),</pre>
                   labels = c("X51D_5_NBH",
                               "X51D_5_S",
                               "X51D_30_NBH",
                               "X51D_30_S",
                               "PrPCyt_5_NBH",
                               "PrPCyt_5_S",
                               "PrPCyt_30_NBH",
                               "PrPCyt_30_S",
                               "PrPGPI_5_NBH",
                               "PrPGPI_5_S",
                               "PrPGPI_40_NBH",
                               "PrPGPI_40_S"))
coldata <- names(data)</pre>
```

```
ggplot(mdsPoisData, aes(x_coord, y_coord, color = groups, label = coldata)) +
  geom_text(size = 4) +
  ggtitle('Multi Dimensional Scaling') +
  labs(x = "Poisson Distance", y = "Poisson Distance") +
  theme_bw()
```

Multi Dimensional Scaling



Some samples clearly deviate from the other 2 in the group. This is especially clear with X51D_5_S, PrPCyt_30_NBH, X51D_30_NBH & PrPCyt_5_S. Strangely, these samples are all the first one in their respective group. This could indicate that the first tests were less accurate. Since 3 samples must remain in each group, no data will be removed from the set.