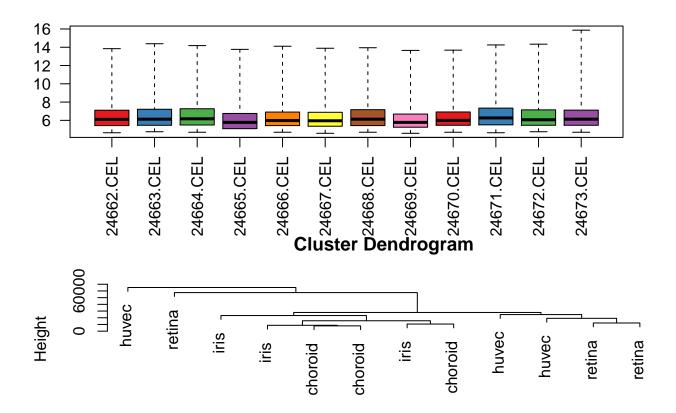
# Lab 4 - Gr. 14 - Bioinformatics (732A93)

Julius Kittler (julki092), Stefano Toffol (steto820), Saewon Jun (saeju204), Maximilian Pfundstein (maxpf364)

Provided source code we have to explain.

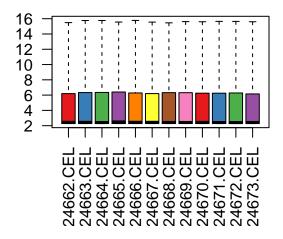
```
##
                                                                         size
   /Users/flennic/git/bioinformatics/Lab4/GSE20986/GSE20986_RAW.tar 56360960
##
##
   /Users/flennic/git/bioinformatics/Lab4/GSE20986/GSE20986 RAW.tar FALSE
##
##
                                                                     mode
##
   /Users/flennic/git/bioinformatics/Lab4/GSE20986/GSE20986_RAW.tar
##
                                                                                   mtime
   /Users/flennic/git/bioinformatics/Lab4/GSE20986/GSE20986_RAW.tar 2018-12-03 14:35:00
##
##
   /Users/flennic/git/bioinformatics/Lab4/GSE20986/GSE20986_RAW.tar 2018-12-03 14:35:00
##
##
                                                                                   atime
   /Users/flennic/git/bioinformatics/Lab4/GSE20986/GSE20986_RAW.tar 2018-12-03 14:34:52
##
##
                                                                     uid gid
   /Users/flennic/git/bioinformatics/Lab4/GSE20986/GSE20986_RAW.tar 501
##
                                                                          20
##
   /Users/flennic/git/bioinformatics/Lab4/GSE20986/GSE20986_RAW.tar flennic
##
##
   /Users/flennic/git/bioinformatics/Lab4/GSE20986/GSE20986_RAW.tar
##
  data/GSM524662.CEL.gz data/GSM524663.CEL.gz data/GSM524664.CEL.gz
##
##
                13555726
                                      13555055
                                                             13555639
##
  data/GSM524665.CEL.gz data/GSM524666.CEL.gz data/GSM524667.CEL.gz
##
                13560122
                                      13555663
                                                             13557614
##
  data/GSM524668.CEL.gz data/GSM524669.CEL.gz data/GSM524670.CEL.gz
##
                13556090
                                      13560054
  data/GSM524671.CEL.gz data/GSM524672.CEL.gz data/GSM524673.CEL.gz
                13554926
                                      13555042
                                                             13555290
  [1] "matrix"
##
9
  GSM524662.CEL
                           GSM524666.CEL
                                                    GSM524670.CEL
    [1] "GSM524662.CEL" "GSM524663.CEL" "GSM524664.CEL" "GSM524665.CEL"
    [5] "GSM524666.CEL" "GSM524667.CEL" "GSM524668.CEL" "GSM524669.CEL"
    [9] "GSM524670.CEL" "GSM524671.CEL" "GSM524672.CEL" "GSM524673.CEL"
```



## distance hclust (\*, "complete")

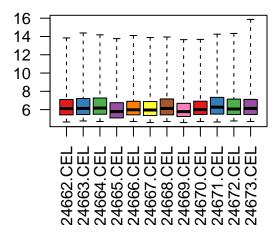
- ## Adjusting for optical effect......Done.
- ## Computing affinities.Done.
- ## Adjusting for non-specific binding......Done.
- ## Normalizing
- ## Calculating Expression

### **Post-Normalization**



#### ## null device

### **Pre-Normalization**



```
##
##
               Name
                         FileName Targets
      GSM524662.CEL GSM524662.CEL
## 2
      GSM524663.CEL GSM524663.CEL
                                    retina
      GSM524664.CEL GSM524664.CEL
                                    retina
## 3
      GSM524665.CEL GSM524665.CEL
## 5
      GSM524666.CEL GSM524666.CEL
                                   retina
## 6
     GSM524667.CEL GSM524667.CEL
                                      iris
      GSM524668.CEL GSM524668.CEL choroid
## 7
## 8 GSM524669.CEL GSM524669.CEL choroid
      GSM524670.CEL GSM524670.CEL choroid
## 10 GSM524671.CEL GSM524671.CEL
                                     huvec
## 11 GSM524672.CEL GSM524672.CEL
                                     huvec
## 12 GSM524673.CEL GSM524673.CEL
                                     huvec
## [1] "sampleschoroid" "sampleshuvec"
                                          "samplesiris"
                                                            "samplesretina"
##
      choroid huvec iris retina
## 1
            0
                  0
                        1
## 2
            0
                  0
                        0
                               1
## 3
            0
                  0
                        0
                               1
## 4
            0
                  0
                        1
## 5
            0
                  0
                        0
                               1
## 6
            0
                  0
                        1
                               0
## 7
            1
                  0
                        0
                               0
## 8
            1
                  0
                        0
                               0
## 9
            1
                  0
                        0
                               0
## 10
            0
                  1
                        0
                               0
## 11
            0
                        0
                  1
                               0
## 12
            0
## attr(,"assign")
## [1] 1 1 1 1
## attr(,"contrasts")
## attr(,"contrasts")$samples
## [1] "contr.treatment"
##
        logFC
                           AveExpr
                                                                 P.Value
                                               t
##
          :-9.19111
                       Min. : 2.279
                                         Min.
                                               :-39.77473
                                                              Min.
                                                                      :0.0000
##
    1st Qu.:-0.05967
                        1st Qu.: 2.281
                                         1st Qu.: -0.70649
                                                              1st Qu.:0.1523
    Median : 0.00000
                       Median : 2.480
                                         Median: 0.00000
                                                              Median :0.5079
                                         Mean
                                               : 0.07441
                                                                      :0.5346
##
    Mean
          :-0.02353
                       Mean
                             : 4.375
                                                              Mean
    3rd Qu.: 0.03986
                        3rd Qu.: 6.241
                                         3rd Qu.: 0.67455
                                                              3rd Qu.:1.0000
##
   Max. : 8.67086
                       Max.
                               :15.541
                                         {\tt Max.}
                                                :296.84201
                                                              Max.
                                                                      :1.0000
##
##
      adj.P.Val
                            В
                                          getsymbols
           :0.0000
                            :-7.710
    Min.
                     Min.
                                       YME1L1 :
                                                    22
    1st Qu.:0.6036
                      1st Qu.:-7.710
                                                    15
##
                                       HFE
                                                    14
##
    Median :1.0000
                     Median :-7.451
                                       CFLAR
                                                :
##
    Mean
                                       NRP2
                                                    14
           :0.7436
                     Mean
                             :-6.582
    3rd Qu.:1.0000
                      3rd Qu.:-6.498
                                       ARHGEF12:
                                                    13
##
    Max.
           :1.0000
                     Max.
                            :21.290
                                       (Other):41857
##
                                       NA's
                                                :12740
##
##
                   3
       1
             2
```

## Assignment 1

#### Task:

- Run all the R code and reproduce the graphics.
- Go carefully through the R code and explain in your words what each step does.

#### Assignment 2

#### Task:

- Present the variables versus each other original, log–scaled and MA–plot for each considered pair both before and after normalization.
- A cluster analysis is performed on the page but not report. Present plots and also draw heatmaps.

## Assignment 3

#### Task:

- Provide volcano plots for the other pairs.
- Indicate significantly differentially expressed genes.
- Explain how they are found.

#### Assignment 4

#### Task:

- Try to find more information on the genes that are reported to be significantly differentially expressed. Report in your own words on what you find.
- Report all the Gene Ontology (GO) terms associated with each gene.
- Are any of the GO terms common between genes?
- If so do the common GO terms seem to be related to anything particular?
- Try to present GO analysis in an informative manner, if possible visualize.

# Appendix

```
# https://www.ncbi.nlm.nih.gov/geo/query/acc. cgi?acc=GSE20986
# Additional
# https://www.bioconductor.org/help/course-materials/ 2015/Uruquay2015/day5-data_analysis.html
# Explanations Graphic
# https://www.bioconductor.org/help/course-materials/2015/Uruguay2015/V6-RNASeq.html
library(ggplot2)
# Use this if BiocManager is not installed
#if (!requireNamespace("BiocManager", quietly = TRUE))
     install.packages("BiocManager")
#library("BiocManager")
# BiocManager packages
# BiocManager::install("GEOquery", version = "3.8")
# BiocManager::install("simpleaffy", version = "3.8")
# BiocManager::install("RColorBrewer", version = "3.8")
# BiocManager::install("affyPLM", version = "3.8")
# BiocManager::install("limma", version = "3.8")
# BiocManager::install("annotate", version = "3.8")
# BiocManager::install("hqu133plus2.db", version = "3.8")
library(GEOquery)
library(simpleaffy)
library(RColorBrewer)
library(affyPLM)
library(limma)
library(hgu133plus2.db)
library(annotate)
# Get the Data
x = getGEOSuppFiles("GSE20986")
# Untar and Unzip
# DONT ADD THE FILE TO GIT IT'S 60MB!
untar("GSE20986/GSE20986_RAW.tar", exdir = "data")
cels = list.files("data/", pattern = "[gz]")
sapply(paste("data", cels, sep = "/"), gunzip)
# Creating phenodata
phenodata = matrix(rep(list.files("data"), 2), ncol =2)
class(phenodata)
phenodata <- as.data.frame(phenodata)</pre>
colnames(phenodata) <- c("Name", "FileName")</pre>
phenodata$Targets <- c("iris",</pre>
                       "retina",
                       "retina",
                       "iris",
                       "retina",
                       "iris",
                       "choroid",
                       "choroid",
```

```
"choroid",
                         "huvec",
                         "huvec",
                         "huvec")
write.table(phenodata, "data/phenodata.txt", quote = F, sep = "\t",
             row.names = F)
celfiles <- read.affy(covdesc = "phenodata.txt", path = "data")</pre>
boxplot(celfiles)
cols = brewer.pal(8, "Set1")
eset <- exprs(celfiles)</pre>
samples <- celfiles$Targets</pre>
colnames(eset)
colnames(eset) <- samples</pre>
boxplot(celfiles, col = cols, las = 2)
distance <- dist(t(eset), method = "maximum")</pre>
clusters <- hclust(distance)</pre>
plot(clusters)
celfiles.gcrma = gcrma(celfiles)
par(mfrow=c(1,2))
boxplot(celfiles.gcrma, col = cols, las = 2, main = "Post-Normalization");
boxplot(celfiles, col = cols, las = 2, main = "Pre-Normalization")
dev.off()
distance <- dist(t(exprs(celfiles.gcrma)), method = "maximum")</pre>
clusters <- hclust(distance)</pre>
plot(clusters)
phenodata
samples <- as.factor(samples)</pre>
design <- model.matrix(~0+samples)</pre>
colnames(design)
colnames(design) <- c("choroid", "huvec", "iris", "retina")</pre>
design
contrast.matrix = makeContrasts(
               huvec_choroid = huvec - choroid,
               huvec_retina = huvec - retina,
               huvec_iris <- huvec - iris,</pre>
               levels = design)
fit = lmFit(celfiles.gcrma, design)
huvec_fit <- contrasts.fit(fit, contrast.matrix)</pre>
huvec_ebay <- eBayes(huvec_fit)</pre>
probenames.list <- rownames(topTable(huvec_ebay, number = 100000))</pre>
getsymbols <- getSYMBOL(probenames.list, "hgu133plus2")</pre>
results <- topTable(huvec_ebay, number = 100000, coef = "huvec_choroid")
results <- cbind(results, getsymbols)</pre>
```

```
summary(results)
results$threshold <- "1"
a <- subset(results, adj.P.Val < 0.05 & logFC > 5)
results[rownames(a), "threshold"] <- "2"</pre>
b <- subset(results, adj.P.Val < 0.05 & logFC < -5)
results[rownames(b), "threshold"] <- "3"</pre>
table(results$threshold)
volcano <- ggplot(data = results,</pre>
                 aes(x = logFC, y = -1*log10(adj.P.Val),
                     colour = threshold,
                    label = getsymbols))
volcano <- volcano +
  geom_point() +
  scale_color_manual(values = c("black", "red", "green"),
                labels = c("Not Significant", "Upregulated", "Downregulated"),
                name = "Key/Legend")
volcano +
  geom_text(data = subset(results, logFC > 5 & -1*log10(adj.P.Val) > 5),
           aes(x = logFC, y = -1*log10(adj.P.Val), colour = threshold,
               label = getsymbols) )
# Question 1
# Question 2
# Question 3
# ------
# Question 4
```