d#Skeleton Key for RNAseq analysis Written By: Ciera Martinez

About

This is the script used to perform differential gene expression analysis using edgeR. The tissue came from p4 leaves of *Solanum lycopersicum* using Laser Capture Microdissection.

Key to Samples

```
genotype: either wildtype of tf2
region: A. tip B. early emmerging leaflet C. base
type: MBR = Marginal Blastozone Region, other = the rachis or midvein region
Samples:
print(sample1)
## [1] "tf2cmbr"
```

```
print(sample2)
```

```
## [1] "wtcmbr"
```

See README.md for more detailed instructions of how to use script

Run the render() function below and everything will be run with report at end.

```
library(rmarkdown)
render("skeletonDE.Rmd", "pdf_document", output_file = paste(sample1,"_",sample2,"_","DE.pdf",sep=""))
```

Analysis (Acutal start)

libraries

```
library(edgeR)
library(yaml)
```

Read in YAML guide

This reads in the information in the de.yml file which has the two names of the samples you are interested in comparing.

```
yamls <- yaml.load_file("de.yml")</pre>
```

This part assigns your YMAL to a object in R. This will be used throughout the script to specify which sample types you are comparing.

```
sample1 <- yamls$sample1
sample2 <- yamls$sample2

## [1] "tf2cmbr"

sample2

## [1] "wtcmbr"</pre>
```

Read in Data

Read in raw count data per gene.

```
counts <- read.delim("../../data/sam2countsResults.tsv",row.names=1)

#check the file
head(counts)
colnames(counts)
#need to convert NA to 0 counts
counts[is.na(counts)] <- 0</pre>
```

Subset DE expirement

Start by subsetting the particular treatments which are being compared. This might need to be modified depending on the naming of your samples. In my case each sample is named by sample and rep number, so the script is identifying any sample with the sample name given in the de.yml file.

```
colnames(counts)
```

```
[1] "tf2ambr1"
                         "tf2ambr3"
                                          "tf2ambr4"
                                                           "tf2ambr6"
##
   [5] "tf2aother1"
                         "tf2aother2"
                                          "tf2aother4"
                                                           "tf2aother7"
##
  [9] "tf2bmbr2"
                         "tf2bmbr5"
                                          "tf2bmbr6"
                                                           "tf2bother1"
## [13] "tf2bother3"
                         "tf2bother4"
                                          "tf2bother6"
                                                           "tf2cmbr1.4"
## [17] "tf2cmbr3"
                         "tf2cmbr6"
                                          "tf2cmbr7"
                                                           "tf2cother2"
## [21] "tf2cother5"
                         "tf2cother6"
                                          "tf2cother7"
                                                           "wtambr2"
## [25] "wtambr4"
                         "wtambr5"
                                          "wtaother1"
                                                           "wtaother5"
                                                           "wtbmbr2"
## [29] "wtaother6"
                         "wtaother7"
                                          "wtaother8"
                         "wtbmbr6"
                                          "wtbmbr8"
                                                           "wtbother1.4"
## [33] "wtbmbr3"
## [37] "wtbother3"
                         "wtbother5"
                                          "wtbother8"
                                                           "wtcmbr10"
## [41] "wtcmbr1.4.6"
                         "wtcmbr2"
                                          "wtcmbr3"
                                                           "wtcmbr7"
## [45] "wtcmbr9"
                         "wtcother1.3.4" "wtcother2"
                                                           "wtcother6"
counts1 <- counts[,grep(sample1, colnames(counts), value = TRUE)]</pre>
count1Len <- length(colnames(counts1)) #used in to specify library group in next step.</pre>
counts2 <- counts[,grep(sample2, colnames(counts), value = TRUE)]</pre>
count2Len <- length(colnames(counts2)) #used to specify library group in next step.</pre>
```

```
counts <- cbind(counts1, counts2)
head(counts)</pre>
```

```
##
                       tf2cmbr1.4 tf2cmbr3 tf2cmbr6 tf2cmbr7 wtcmbr10
## Solvc00g005040.2.1
                                 0
                                          6
                                                    8
                                                              4
                                                                        0
## Solyc00g005050.2.1
                                                   17
                                                             12
                                                                        5
                                         34
                                 1
## Solyc00g005060.1.1
                                 0
                                          1
                                                    0
                                                              0
                                                                        1
## Solyc00g005070.1.1
                                23
                                                    8
                                                              9
                                                                        5
                                         11
## Solyc00g005080.1.1
                                22
                                          7
                                                    8
                                                             12
                                                                        0
## Solyc00g005150.1.1
                                                                        0
                                          3
                                                    0
                                                              0
                                 1
##
                       wtcmbr1.4.6 wtcmbr2 wtcmbr3 wtcmbr7 wtcmbr9
## Solyc00g005040.2.1
                                          3
                                                            0
                                  9
                                                   1
                                                                    0
## Solyc00g005050.2.1
                                 38
                                         21
                                                  11
                                                            4
                                                                    7
## Solyc00g005060.1.1
                                  3
                                          0
                                                   0
                                                            1
                                                                    0
## Solyc00g005070.1.1
                                 12
                                          7
                                                   4
                                                            6
                                                                    1
                                                                    7
## Solyc00g005080.1.1
                                  7
                                                  45
                                         19
## Solyc00g005150.1.1
                                  1
                                          3
                                                   3
                                                            2
                                                                    1
```

Add column specifying library Group

Make a vector called group that will be used to make a new column named group to identify library region type.

```
group <- c(rep(sample1, count1Len), rep(sample2, count2Len))
d <- DGEList(counts=counts,group=group)</pre>
```

Check to see if the group column matches your sample name and they are appropriate.

d\$samples

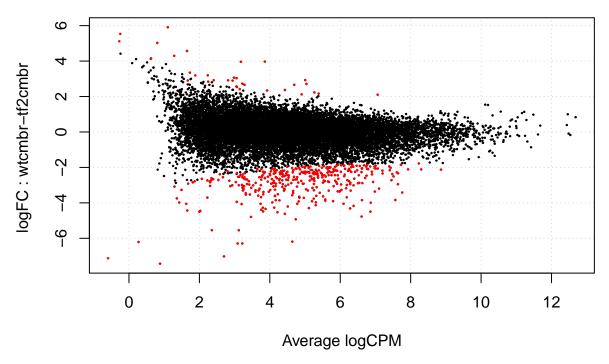
```
group lib.size norm.factors
##
## tf2cmbr1.4 tf2cmbr
                         443572
                                            1
## tf2cmbr3
               tf2cmbr 1337575
                                            1
## tf2cmbr6
               tf2cmbr
                         790129
                                            1
## tf2cmbr7
               tf2cmbr
                         832907
                                            1
## wtcmbr10
                wtcmbr
                         459717
                                            1
## wtcmbr1.4.6 wtcmbr
                        1158809
                                            1
## wtcmbr2
                wtcmbr
                        1130695
                                            1
## wtcmbr3
                wtcmbr
                        1560130
                                            1
## wtcmbr7
                wtcmbr
                          374882
                                            1
## wtcmbr9
                          386974
                                             1
                wtcmbr
```

Differential expression using edgeR

Make sure there is full understanding of each edgeR command being used. The manual is amazing so read it before running the DE analysis below edgeR manual. There are many options and they must be set to be appropriate for your analysis.

```
cpm.d <- cpm(d) #counts per mutant</pre>
d <- d[rowSums(cpm.d>5)>=3,] #This might be a line to adjust. It is removing genes with low counts.
d <- estimateCommonDisp(d,verbose=T)</pre>
## Disp = 0.3524 , BCV = 0.5936
d <- calcNormFactors(d)</pre>
d <- estimateCommonDisp(d)</pre>
DEtest <- exactTest(d,pair=c(sample1,sample2))</pre>
head(DEtest$table)
                         logFC logCPM PValue
##
## Solyc00g005050.2.1 -0.01411 4.214 1.00000
## Solyc00g005070.1.1 -1.53465 3.950 0.01710
## Solyc00g005080.1.1 -0.59400 4.263 0.28619
## Solyc00g005440.1.1 0.38877 4.794 0.53700
## Solyc00g005840.2.1 0.36635 4.812 0.51212
## Solyc00g005880.1.1 -1.50325 3.081 0.03331
results <- topTags(DEtest, n=Inf)</pre>
head(results)
## Comparison of groups: wtcmbr-tf2cmbr
                       logFC logCPM
                                       PValue
## Solyc02g023990.2.1 -5.920 6.420 1.417e-18 2.223e-14
## Solyc11g013430.1.1 -7.053 5.030 1.393e-16 1.093e-12
## Solyc01g056770.1.1 -6.343 5.035 1.634e-15 8.418e-12
## Solyc06g069460.1.1 -5.717 5.054 2.146e-15 8.418e-12
## Solyc07g044980.2.1 -4.743 7.738 7.227e-15 2.267e-11
## Solyc01g098190.2.1 -4.638 5.924 8.269e-14 2.162e-10
dim(results$table)
## [1] 15687
sum(results$table$FDR<.05) # How many are DE genes?</pre>
## [1] 401
summary(decideTestsDGE(DEtest,p.value=.05))
##
      [,1]
## -1
        367
## 0 15286
## 1
```

```
sig.genes <- rownames(results$table[results$table$FDR<0.05,]) # outputs just significant gene names
plotSmear(d,de.tags=sig.genes)
```



Subset all the genes with a significant FDR score less than .05.

```
results.sig <- subset(results$table, results$table$FDR < 0.05)</pre>
```

dim(results.sig)

What are the genes that are misexpressed? For this we need to add some annotation.

Essentially we are merging two annotations files to 1.) only sig genes 2.) all genes

```
annotation1<- read.delim("../../data/ITAG2.3_all_Arabidopsis_ITAG_annotations.tsv", header=FALSE)
colnames(annotation1) <- c("ITAG", "SGN_annotation")
annotation2<- read.delim ("../../data/ITAG2.3_all_Arabidopsis_annotated.tsv")
annotation <- merge(annotation1, annotation2, by = "ITAG")
head(annotation)</pre>
```

```
## ITAG
## 1 Solyc00g005000.2.1
## 2 Solyc00g005040.2.1
## 3 Solyc00g005050.2.1
## 4 Solyc00g005080.1.1
## 5 Solyc00g005900.1.1
## 6 Solyc00g006490.2.1
##
## 1
## 2
## 3
```

4

Aspartic proteinase nepenthesin I (AHRD V1 **-- Potassium channel (AHRD V1 ***- DOEM91_9ROSI

```
## 5 Oxygen-evolving enhancer protein 1, chloroplastic (AHRD V1 ***- PSBO_SOLTU); contains Interpro dom
        Serine/threonine-protein phosphatase 6 regulatory subunit 3 (AHRD V1 **-- SAPS3_HUMAN); contain
## 6
##
           AGI symbol
## 1 AT3G20015
                 <NA>
## 2 AT5G46240
                 KAT1
## 3 AT5G11680
                 <NA>
## 4 ATCG01280 YCF2.2
## 5 AT5G66570 MSP-1
## 6 AT1G07990
                 <NA>
##
## 1
## 2
## 3
## 4
## 5
## 6 SIT4 phosphatase-associated family protein; similar to SIT4 phosphatase-associated family protein
     X..identity alignment.length e.value bit.score percent.query.align
           63.76
## 1
                               447
                                    7e-148
                                                 520
## 2
           66.02
                               103
                                     2e-37
                                                 150
                                                                    85.71
## 3
           76.96
                               204
                                     1e-88
                                                 322
                                                                    98.98
## 4
           91.25
                                80
                                     2e-38
                                                 153
                                                                    79.80
## 5
           69.62
                                79
                                     4e-26
                                                                    78.79
                                                 112
                                                                    99.77
## 6
           61.92
                                     0e+00
                                                 979
                               856
#Making the only significant gene table
results.sig$ITAG <- rownames(results.sig) #change row.names to ITAG for merging
results.sig.annotated <- merge(results.sig,annotation,by = "ITAG", all.x=TRUE) #This is merging only si
#Making all table
results$table$ITAG <- rownames(results$table)</pre>
results.all.annotated <- merge(results$table, annotation,by = "ITAG")
```

Write table with results.

```
write.table(results.all.annotated, file=paste(sample1,"_",sample2,"_","DE_all.txt",sep=""),sep="\t",row
write.table(results.sig.annotated, file=paste(sample1,"_",sample2,"_","DE_sig.txt",sep=""),sep="\t",row
```

Now run the script below for a full knitr report of what was run and leave this report in the folder that the analysis was done with output files.