Khan Inan hw 4

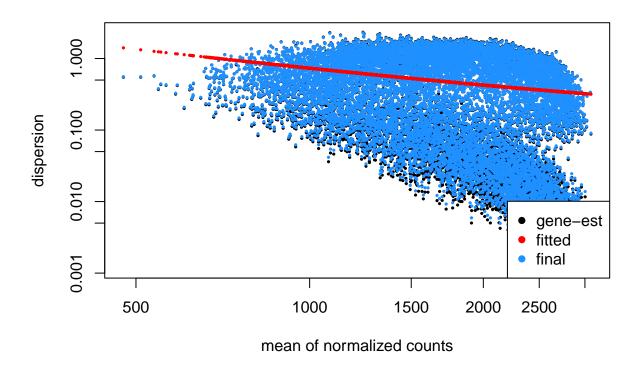
2023-04-07

```
GSE124548.raw.fixed <- read.delim("C:/Users/khani/Downloads/GSE124548.raw.fixed.txt", header=FALSE)
#Specifying columns with HC or CF base
readcount <- GSE124548.raw.fixed[, c(1,4,5,7,8,10,11,13,14,15,16,18,19,21,22,24,26,27,28,29,30,
                                       32,33,35,36,37,38,39,40,41,42,43,45,47,49)]
#Setting row names and column names
rownames(readcount) <- readcount[,1]</pre>
readcount <- readcount[,-1]</pre>
colnames(readcount) = readcount[1,]
readcount <- readcount[-1,]</pre>
readcount = data.matrix(readcount)
head(readcount)
##
          Raw_10_HC_Auto_066_237 Raw_11_Orkambi_006_Base Raw_13_HC_Auto_068_239
## 1
                              3482
                                                       2013
## 503538
                                                       1720
                              2712
                                                                                1468
## 144571
                              3348
                                                        114
                                                                                2310
## 8086
                              767
                                                       3146
                                                                                3230
## 65985
                             1149
                                                        352
                                                                                238
## 195827
                             1018
                                                        164
                                                                                1137
##
          Raw_14_Orkambi_007_Base Raw_16_HC_Auto_072_243 Raw_17_Orkambi_009_Base
## 1
                              3105
                                                        405
                                                                                 702
## 503538
                               2266
                                                       3923
                                                                                4164
## 144571
                               2404
                                                         92
                                                                                3120
## 8086
                                238
                                                       1686
                                                                                 637
## 65985
                                787
                                                       1452
                                                                                1840
                               1063
## 195827
                                                       1666
                                                                                2174
##
          Raw_19_HC_Auto_074_245 Raw_1_Orkambi_001_Base Raw_20_Orkambi_010_Base
## 1
                               71
                                                      3242
## 503538
                              2908
                                                      2105
                                                                               3143
## 144571
                              1167
                                                       625
                                                                                693
## 8086
                              630
                                                      3225
                                                                                522
## 65985
                              670
                                                       381
                                                                                1276
## 195827
                             1582
                                                       254
                                                                               1535
##
          Raw_21_HC_Immune_004 Raw_23_HC_Auto_076_247 Raw_24_Orkambi_012_Base
## 1
                            275
                                                    3450
                                                    3474
## 503538
                           3799
                                                                             3236
## 144571
                           4051
                                                    3814
                                                                              513
## 8086
                           1220
                                                    1349
                                                                              465
## 65985
                           1329
                                                    1010
                                                                             1454
## 195827
                           1982
                                                    1757
          Raw_26_HC_Auto_078_249 Raw_27_Orkambi_013_Base Raw_29_HC_Auto_080_251
##
## 1
                             3039
                                                       3620
```

503538

```
3364
                                                        2774
## 144571
                                                                                 163
## 8086
                               304
                                                        1039
                                                                                 1479
## 65985
                               581
                                                         897
                                                                                 1252
## 195827
                               697
                                                        1287
                                                                                 1773
          Raw_30_Orkambi_014_Base Raw_3_HC_Auto_062_233 Raw_42_HC_Auto_089_261
## 1
                               2955
                                                       3198
                                                                                3549
## 503538
                               1967
                                                       2484
                                                                                2953
## 144571
                               2010
                                                                                3757
                                                       2103
## 8086
                                161
                                                        655
                                                                                601
## 65985
                                311
                                                        357
                                                                                778
## 195827
                                760
                                                        792
                                                                                1173
          Raw_4_HC_Immune_002 Raw_5_Orkambi_002_Base Raw_7_HC_Auto_064_235
##
## 1
                          2560
                                                   2163
                                                                           3626
## 503538
                          2166
                                                   2006
                                                                           3421
## 144571
                           3247
                                                   3217
                                                                           3544
## 8086
                            339
                                                    424
                                                                           1064
## 65985
                            493
                                                    902
                                                                            813
## 195827
                            600
                                                     891
                                                                           1107
##
          Raw_8_Orkambi_004_Base Raw_HC_Auto_082_253 Raw_HC_Auto_084_255
## 1
                              2867
                                                    452
                                                                         2981
## 503538
                              2548
                                                   3191
                                                                         2047
## 144571
                               520
                                                   3324
                                                                         2276
## 8086
                              3108
                                                    939
                                                                           34
## 65985
                              3364
                                                   1063
                                                                          518
                                 3
## 195827
                                                   1857
                                                                          558
          Raw_HC_Auto_088_259 Raw_HC_Auto_091_263 Raw_HC_Auto_093_265
## 1
                          3699
                                                   2
                                                                       177
## 503538
                          3080
                                                3059
                                                                      4457
## 144571
                           713
                                                3790
                                                                      1008
## 8086
                             42
                                                3755
                                                                      1388
## 65985
                           1058
                                                 926
                                                                      2094
## 195827
                          1401
                                                1967
                                                                      2779
##
          Raw_HC_Auto_095_267 Raw_HC_Immune_006 Raw_HC_Immune_008
## 1
                          3886
                                              3786
                                                                  430
## 503538
                                              2728
                          2704
                                                                  2816
## 144571
                           282
                                              3583
                                                                 2466
                                                                 3665
## 8086
                           256
                                               186
## 65985
                          1115
                                              1320
                                                                  778
## 195827
                          1642
                                              1571
                                                                  1794
##
          Raw_Orkambi_015_Base Raw_Orkambi_016_Base Raw_Orkambi_017_Base
## 1
                           3899
                                                  1854
## 503538
                            3498
                                                  1970
                                                                         3153
## 144571
                                                   966
                                                                         3946
                            3104
## 8086
                                                  2518
                                                                         4142
                            1255
## 65985
                            1377
                                                   458
                                                                         1606
## 195827
                                                   499
                                                                         1799
                            1357
##
          Raw_Orkambi_018_Base
## 1
                             244
## 503538
                            2981
## 144571
                             133
## 8086
                               2
## 65985
                            1705
## 195827
                            2058
```

```
#Creating data frame with condition column
expgroup <- data.frame(condition = c("HC", "CF", "HC", "CF", "HC", "CF", "HC", "CF", "CF", "HC",
                                     "HC", "CF", "HC", "CF", "HC", "CF", "HC", "HC", "HC", "CF",
                                      "HC", "CF", "HC", "HC", "HC", "HC", "HC", "HC", "HC",
                                      "CF", "CF", "CF", "CF"), row.names = colnames(readcount))
head(expgroup)
##
                           condition
## Raw_10_HC_Auto_066_237
                                  HC
                                  CF
## Raw 11 Orkambi 006 Base
## Raw_13_HC_Auto_068_239
                                  HC
## Raw 14 Orkambi 007 Base
                                  CF
## Raw_16_HC_Auto_072_243
                                  HC
## Raw_17_Orkambi_009_Base
                                  CF
#STEP 3
#creating the matrix for the counts dataset
cds <- DESeqDataSetFromMatrix(countData = readcount, colData = expgroup, design = ~ condition)</pre>
## Warning in DESeqDataSet(se, design = design, ignoreRank): some variables in
## design formula are characters, converting to factors
head(cds)
## class: DESeqDataSet
## dim: 6 34
## metadata(1): version
## assays(1): counts
## rownames(6): 1 503538 ... 65985 195827
## rowData names(0):
## colnames(34): Raw_10_HC_Auto_066_237 Raw_11_Orkambi_006_Base ...
## Raw_Orkambi_017_Base Raw_Orkambi_018_Base
## colData names(1): condition
#STEP 4
#correcting the size
cds <- estimateSizeFactors(cds)</pre>
cds <- estimateDispersions(cds)</pre>
## gene-wise dispersion estimates
## mean-dispersion relationship
## final dispersion estimates
#plotting
plotDispEsts(cds)
```



The graph essentially tells me the about how the dispersion related to the normalized counts. The red dotted line respresents the fitted line for the estimates of the dispersion. The grap itself shows me that the dispersion level increased along with the means. The dispersion cluster does not and should not show any kind of bending or skew

```
##STEP 5
#doing the differential analysis
cds <- DESeq(cds)

## using pre-existing size factors

## estimating dispersions

## found already estimated dispersions, replacing these

## gene-wise dispersion estimates

## mean-dispersion relationship

## final dispersion estimates

## fitting model and testing

## -- replacing outliers and refitting for 18 genes

## -- DESeq argument 'minReplicatesForReplace' = 7

## -- original counts are preserved in counts(dds)
```

estimating dispersions

fitting model and testing

```
#getting the results
results <- results(cds)</pre>
```

#STEP 6 #subsetting the genes with specific parameters such as p-value and log2foldchange values diffexpgenes <- subset(results, padj < 0.05 & abs(log2FoldChange) > 1) #counting the genes in this subset nrow(diffexpgenes)

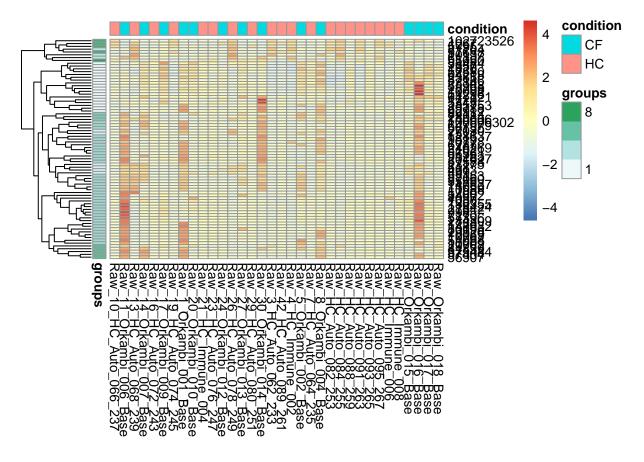
[1] 78

```
#STEP 7
#normalizing the data from the counts
normvalues <- counts(cds, normalized = TRUE)
head(normvalues)</pre>
```

##		Raw_10_HC_Auto_066_237	Raw_11_Orkambi_006_Base	Raw_13_HC_Auto_068_239
##	1	3190.7881	2602.4327	2955.8028
##	503538	2485.1859	2223.6385	1902.2878
##	144571	3067.9950	147.3807	2993.3820
##	8086	702.8531	4067.1899	4185.5515
##	65985	1052.9051	455.0702	308.4091
##	195827	932.8611	212.0213	1473.3660
##		Raw_14_Orkambi_007_Base	Raw_16_HC_Auto_072_243	Raw_17_Orkambi_009_Base
##	1	3153.7934	289.74110	450.5253
##	503538	2301.6090	2806.55390	2672.3467
##	144571	2441.7776	65.81773	2002.3347
##	8086	241.7400	1206.18146	408.8100
##	65985	799.3673	1038.77549	1180.8641
##	195827	1079.7045	1191.87326	1395.2166
##		Raw_19_HC_Auto_074_245	Raw_1_Orkambi_001_Base H	Raw_20_Orkambi_010_Base
##	1	65.8643	3780.5536	77.8705
##	503538	2697.6534	2454.6778	2603.6914
##	144571	1082.5865	728.8236	574.0879
##	8086	584.4297	3760.7296	432.4298
##	65985	621.5364	444.2908	1057.0507
##	195827	1467.5680	296.1939	1271.6088
##		Raw_21_HC_Immune_004 Ra	w_23_HC_Auto_076_247 Rav	v_24_Orkambi_012_Base
##	1	209.8622	2673.7707	51.7377
##	503538	2899.1506	2692.3709	2790.3868
##	144571	3091.4607	2955.8729	442.3574
##	8086	931.0249	1045.4831	400.9672
##	65985	1014.2067	782.7561	1253.7770
##	195827	1512.5340	1361.6856	1543.5081
##		Raw_26_HC_Auto_078_249	Raw_27_Orkambi_013_Base	Raw_29_HC_Auto_080_251
##	1	3642.2150	3040.6218	504.9728
	503538	3053.7558	2230.0693	2976.0840
##	144571	4031.7247	2330.0235	123.4041

```
## 8086
                         364.3414
                                                  872.7089
                                                                          1119.7223
## 65985
                         696.3234
                                                  753.4359
                                                                           947.8650
## 195827
                         835.3484
                                                 1081.0167
                                                                          1342.3040
          Raw_30_Orkambi_014_Base Raw_3_HC_Auto_062_233 Raw_42_HC_Auto_089_261
##
## 1
                         3568.6726
                                                3452.0078
                                                                         2893.6901
## 503538
                         2375.4920
                                                2681.2968
                                                                         2407.7394
## 144571
                         2427.4220
                                                2270.0351
                                                                         3063.2837
## 8086
                          194.4353
                                                 707.0247
                                                                          490.0275
## 65985
                          375.5862
                                                 385.3555
                                                                          634.3451
## 195827
                          917.8312
                                                 854.9062
                                                                          956.4098
##
          Raw_4_HC_Immune_002 Raw_5_Orkambi_002_Base Raw_7_HC_Auto_064_235
## 1
                     2947.2962
                                             2170.0541
                                                                     3277.2420
## 503538
                     2493.6889
                                             2012.5421
                                                                     3091.9595
## 144571
                     3738.2308
                                             3227.4915
                                                                     3203.1290
## 8086
                      390.2865
                                              425.3828
                                                                     961.6618
## 65985
                      567.5848
                                              904.9417
                                                                     734.8036
## 195827
                      690.7726
                                              893.9058
                                                                     1000.5259
##
          Raw 8 Orkambi 004 Base Raw HC Auto 082 253 Raw HC Auto 084 255
## 1
                      3053.687271
                                              391.7258
                                                                 3400.75818
## 503538
                      2713.915301
                                             2765.4804
                                                                 2335.24052
                                                                 2596.48629
## 144571
                       553.860265
                                             2880.7449
## 8086
                      3310.380202
                                              813.7844
                                                                   38.78758
## 65985
                      3583.049871
                                              921.2490
                                                                  590.94020
## 195827
                         3.195348
                                             1609.3692
                                                                  636.57265
##
          Raw HC Auto 088 259 Raw HC Auto 091 263 Raw HC Auto 093 265
## 1
                    2815.73516
                                           1.660216
                                                                110.2262
## 503538
                    2344.54293
                                        2539.300047
                                                               2775.5831
## 144571
                     542.74646
                                                                627.7289
                                        3146.108917
## 8086
                      31.97104
                                        3117.055141
                                                                864.3728
## 65985
                     805.36572
                                         768.679910
                                                               1304.0321
## 195827
                    1066.46255
                                        1632.822227
                                                               1730.6138
##
          Raw_HC_Auto_095_267 Raw_HC_Immune_006 Raw_HC_Immune_008
## 1
                     3514.3460
                                        3126.4690
                                                            399.8607
## 503538
                     2445.3916
                                        2252.7754
                                                           2618.6226
## 144571
                      255.0297
                                        2958.8322
                                                           2293.1545
                                         153.5983
## 8086
                      231.5164
                                                           3408.1149
## 65985
                     1008.3623
                                        1090.0526
                                                            723.4689
## 195827
                     1484.9604
                                        1297.3278
                                                           1668.2560
##
          Raw_Orkambi_015_Base Raw_Orkambi_016_Base Raw_Orkambi_017_Base
## 1
                      2897.0026
                                            2366.9243
                                                                   201.9968
## 503538
                      2599.0549
                                            2515.0167
                                                                  2430.9002
## 144571
                      2306.3083
                                            1233.2518
                                                                  3042.2874
## 8086
                       932.4797
                                            3214.6254
                                                                  3193.3995
## 65985
                                             584.7095
                      1023.1271
                                                                  1238.1940
## 195827
                      1008.2669
                                             637.0524
                                                                  1386.9932
##
          Raw_Orkambi_018_Base
## 1
                     186.850617
## 503538
                    2282.793810
## 144571
                     101.848902
## 8086
                       1.531562
## 65985
                    1305.656976
## 195827
                    1575.977746
```

```
#STEP 8
#creating the matric for the genes that are differentially expressed
diffexpvalues <- normvalues[rownames(diffexpgenes), ]</pre>
#STEP 9
#doing the hierarchical clustering
hc <- hclust(dist(diffexpvalues), method = "complete")</pre>
#splitting the tree into 8 groups
groups <- cutree(hc, k = 8)</pre>
#counting the number of genes in each of the groups
table(groups)
## groups
## 1 2 3 4 5 6 7 8
## 18 6 3 38 3 5 4 1
The number of genes in each group are shown in the table above
#creating the heatmap. I had some difficulty incorporating annotation_row at first
library(pheatmap)
## Warning: package 'pheatmap' was built under R version 4.2.3
groups <- data.frame(groups)</pre>
pheatmap(diffexpvalues, scale = "row", cluster_cols = F, shown_rownames = F,
         annotation_col = expgroup, annotation_row = groups)
```



#STEP 12

Based on my analysis throughout this process I have found genes that are differentially expressed between the CF patients before the treatment as well as the healthy patients. In reference to GO terms and GO stats, the genes do show signs of being impacted in CF. The heatmap shows patterns of differential expression as well because some genes show higher expression than others. The hiarchical clustering was useful for grouping the genes based on the patterns they portray during expression. In conclusion, I would say that there is definitely a difference between healthy and CF patients. The next steps would be to find out what are the roles of these genes in terms of vital biological functions, and then we can better understand the effects of CF and what it can target