

# BioinformaticsHW\_IsabelMetzger

ISABEL METZGER BIOINFORMATICS FALL 2017 LOADING EDGER

```
library(limma)
```

```
## Warning: package 'limma' was built under R version 3.4.2
```

```
library(edgeR)
```

```
library(car)
```

## Read in count table and experimental design:

```
ovarian_df <- read.delim("GSE52695_Ovarian_RefSeq_RPKM_Values.txt",  
                        row.names=1, header=T)
```

```
head(ovarian_df)
```

```
##      Library_1 Library_10 Library_11 Library_12 Library_2 Library_3  
## A1BG      0.2621930  0.9163250  0.90431500 1.03555000 0.30342000 0.3397060  
## A1BG-AS1  0.9704190  0.8373180  1.38764000 1.51185000 0.66485800 1.0530700  
## A1CF      0.0103266  0.0212174  0.03549150 0.00425699 0.01229490 0.0111711  
## A2LD1     0.5142540  1.5253800  0.92915700 1.10681000 0.41714800 0.4988250  
## A2M       0.0000000  0.0283904  0.00647592 0.00854420 0.00822571 0.0000000  
## A2ML1     0.0000000  0.0127313  0.01161620 0.00766310 0.00737746 0.0000000  
##      Library_4 Library_5 Library_6 Library_7 Library_8 Library_9  
## A1BG      0.44528100 0.51423700 0.30590300 0.6488740 0.65693400 0.81654700  
## A1BG-AS1  0.68563300 0.64529800 0.99422200 1.0894200 0.99634600 0.86571700  
## A1CF      0.00902164 0.01051260 0.00925534 0.0214581 0.01211950 0.02153980  
## A2LD1     0.65327200 0.40458300 0.50209300 0.5161380 0.42464100 1.39639000  
## A2M       0.37421800 0.00527496 0.00928820 0.00000000 0.00608129 0.00000000  
## A2ML1     0.00000000 0.00000000 0.00000000 0.00000000 0.00000000 0.00646238
```

the dataframe contains 22446 rows (genes) and a total of 12 cols (12 libraries)

```
dim(ovarian_df)
```

```
## [1] 22446    12
```

Reordering column names

```
reorder.colnames <- paste("Library", 1:12, sep="_")
```

```
reorder.colnames
```

```
## [1] "Library_1" "Library_2" "Library_3" "Library_4" "Library_5"  
## [6] "Library_6" "Library_7" "Library_8" "Library_9" "Library_10"  
## [11] "Library_11" "Library_12"
```

```
ovarian_reordered_df <- ovarian_df[,reorder.colnames]
```

```
head(ovarian_reordered_df)
```

```
##      Library_1 Library_2 Library_3 Library_4 Library_5 Library_6  
## A1BG      0.2621930 0.30342000 0.3397060 0.44528100 0.51423700 0.30590300  
## A1BG-AS1  0.9704190 0.66485800 1.0530700 0.68563300 0.64529800 0.99422200
```

```
## A1CF      0.0103266 0.01229490 0.0111711 0.00902164 0.01051260 0.00925534
## A2LD1     0.5142540 0.41714800 0.4988250 0.65327200 0.40458300 0.50209300
## A2M       0.0000000 0.00822571 0.0000000 0.37421800 0.00527496 0.00928820
## A2ML1     0.0000000 0.00737746 0.0000000 0.00000000 0.00000000 0.00000000
##          Library_7 Library_8 Library_9 Library_10 Library_11 Library_12
## A1BG      0.6488740 0.65693400 0.81654700 0.9163250 0.90431500 1.03555000
## A1BG-AS1  1.0894200 0.99634600 0.86571700 0.8373180 1.38764000 1.51185000
## A1CF      0.0214581 0.01211950 0.02153980 0.0212174 0.03549150 0.00425699
## A2LD1     0.5161380 0.42464100 1.39639000 1.5253800 0.92915700 1.10681000
## A2M       0.0000000 0.00608129 0.00000000 0.0283904 0.00647592 0.00854420
## A2ML1     0.0000000 0.00000000 0.00646238 0.0127313 0.01161620 0.00766310
```

Creating new colnames

```
newcolnames <- paste("GSM12742", 53:64, sep="") #2 or more vectors pasted element for element.
```

```
newcolnames
```

```
## [1] "GSM1274253" "GSM1274254" "GSM1274255" "GSM1274256" "GSM1274257"
## [6] "GSM1274258" "GSM1274259" "GSM1274260" "GSM1274261" "GSM1274262"
## [11] "GSM1274263" "GSM1274264"
```

```
library(data.table)
```

```
## Warning: package 'data.table' was built under R version 3.4.2
```

```
new_ovarian_df <- setnames(ovarian_reordered_df,
                           old=reorder.colnames, new=newcolnames)
```

```
head(new_ovarian_df)
```

```
##          GSM1274253 GSM1274254 GSM1274255 GSM1274256 GSM1274257 GSM1274258
## A1BG      0.2621930 0.30342000 0.3397060 0.44528100 0.51423700 0.30590300
## A1BG-AS1  0.9704190 0.66485800 1.0530700 0.68563300 0.64529800 0.99422200
## A1CF      0.0103266 0.01229490 0.0111711 0.00902164 0.01051260 0.00925534
## A2LD1     0.5142540 0.41714800 0.4988250 0.65327200 0.40458300 0.50209300
## A2M       0.0000000 0.00822571 0.0000000 0.37421800 0.00527496 0.00928820
## A2ML1     0.0000000 0.00737746 0.0000000 0.00000000 0.00000000 0.00000000
##          GSM1274259 GSM1274260 GSM1274261 GSM1274262 GSM1274263 GSM1274264
## A1BG      0.6488740 0.65693400 0.81654700 0.9163250 0.90431500 1.03555000
## A1BG-AS1  1.0894200 0.99634600 0.86571700 0.8373180 1.38764000 1.51185000
## A1CF      0.0214581 0.01211950 0.02153980 0.0212174 0.03549150 0.00425699
## A2LD1     0.5161380 0.42464100 1.39639000 1.5253800 0.92915700 1.10681000
## A2M       0.0000000 0.00608129 0.00000000 0.0283904 0.00647592 0.00854420
## A2ML1     0.0000000 0.00000000 0.00646238 0.0127313 0.01161620 0.00766310
```

Genes are now row names and what is left is the counts/ expression levels. See below for the renamed columns.

```
length(reorder.colnames)
```

```
## [1] 12
```

```
length(newcolnames)
```

```
## [1] 12
```

```
treatment <- c("Normoxia_6hr (total RNA)_1", "Normoxia_6hr (total RNA)_2",
               "Hypoxia_6hr (total RNA)_3", "Hypoxia_6hr (total RNA)_4", "Normoxia_48hr (total RNA)_5", "Hypoxia_48hr (total RNA)_6")
```

```

      "Hypoxia_48hr (total RNA)_8", "Normoxia_6days (total RNA)_9", "Normoxia_6days (total RNA)_12",
length(treatment)

```

```
## [1] 12
```

```
keydf <- data.frame(reorder.colnames, newcolnames, treatment)
```

```
keydf$treatmentsimplified <- c("Normoxia", "Normoxia", "Hypoxia", "Hypoxia", "Normoxia", "Normoxia", "Hypoxia", "Hypoxia", "Normoxia", "Normoxia", "Hypoxia", "Hypoxia")
```

```
keydf
```

```
##      reorder.colnames newcolnames      treatment
## 1      Library_1    GSM1274253  Normoxia_6hr (total RNA)_1
## 2      Library_2    GSM1274254  Normoxia_6hr (total RNA)_2
## 3      Library_3    GSM1274255   Hypoxia_6hr (total RNA)_3
## 4      Library_4    GSM1274256   Hypoxia_6hr (total RNA)_4
## 5      Library_5    GSM1274257  Normoxia_48hr (total RNA)_5
## 6      Library_6    GSM1274258  Normoxia_48hr (total RNA)_6
## 7      Library_7    GSM1274259   Hypoxia_48hr (total RNA)_7
## 8      Library_8    GSM1274260   Hypoxia_48hr (total RNA)_8
## 9      Library_9    GSM1274261  Normoxia_6days (total RNA)_9
## 10     Library_10   GSM1274262  Normoxia_6days (total RNA)_10
## 11     Library_11   GSM1274263   Hypoxia_6days (total RNA)_11
## 12     Library_12   GSM1274264   Hypoxia_6days (total RNA)_12
##      treatmentsimplified
## 1              Normoxia
## 2              Normoxia
## 3              Hypoxia
## 4              Hypoxia
## 5              Normoxia
## 6              Normoxia
## 7              Hypoxia
## 8              Hypoxia
## 9              Normoxia
## 10             Normoxia
## 11             Hypoxia
## 12             Hypoxia
```

```
group <- keydf$treatmentsimplified
```

```
group
```

```
## [1] "Normoxia" "Normoxia" "Hypoxia" "Hypoxia" "Normoxia" "Normoxia"
## [7] "Hypoxia" "Hypoxia" "Normoxia" "Normoxia" "Hypoxia" "Hypoxia"
```

```
head(new_ovarian_df)
```

```
##      GSM1274253 GSM1274254 GSM1274255 GSM1274256 GSM1274257 GSM1274258
## A1BG      0.2621930 0.30342000 0.3397060 0.44528100 0.51423700 0.30590300
## A1BG-AS1  0.9704190 0.66485800 1.0530700 0.68563300 0.64529800 0.99422200
## A1CF      0.0103266 0.01229490 0.0111711 0.00902164 0.01051260 0.00925534
## A2LD1     0.5142540 0.41714800 0.4988250 0.65327200 0.40458300 0.50209300
## A2M       0.0000000 0.00822571 0.0000000 0.37421800 0.00527496 0.00928820
## A2ML1     0.0000000 0.00737746 0.0000000 0.00000000 0.00000000 0.00000000
##      GSM1274259 GSM1274260 GSM1274261 GSM1274262 GSM1274263 GSM1274264
## A1BG      0.6488740 0.65693400 0.81654700 0.9163250 0.90431500 1.03555000
## A1BG-AS1  1.0894200 0.99634600 0.86571700 0.8373180 1.38764000 1.51185000
```

```
## A1CF      0.0214581 0.01211950 0.02153980 0.0212174 0.03549150 0.00425699
## A2LD1     0.5161380 0.42464100 1.39639000 1.5253800 0.92915700 1.10681000
## A2M       0.0000000 0.00608129 0.00000000 0.0283904 0.00647592 0.00854420
## A2ML1     0.0000000 0.00000000 0.00646238 0.0127313 0.01161620 0.00766310
```

*#Create DGEList object with groups for the treatments N and H*

```
cds <- DGEList(new_ovarian_df, group = group )
dim(cds)
```

```
## [1] 22446    12
```

*#Filter out genes with low counts, keeping those rows where the count  
#per million (cpm) is at least 1 in at least three samples:*

```
keep <- rowSums(cpm(cds)>1) >=3
cds <- cds[keep,]
dim(cds)           # How many genes are left?
```

```
## [1] 12162    12
```

```
cds <- calcNormFactors(cds) #normalize number of reads per sample
```

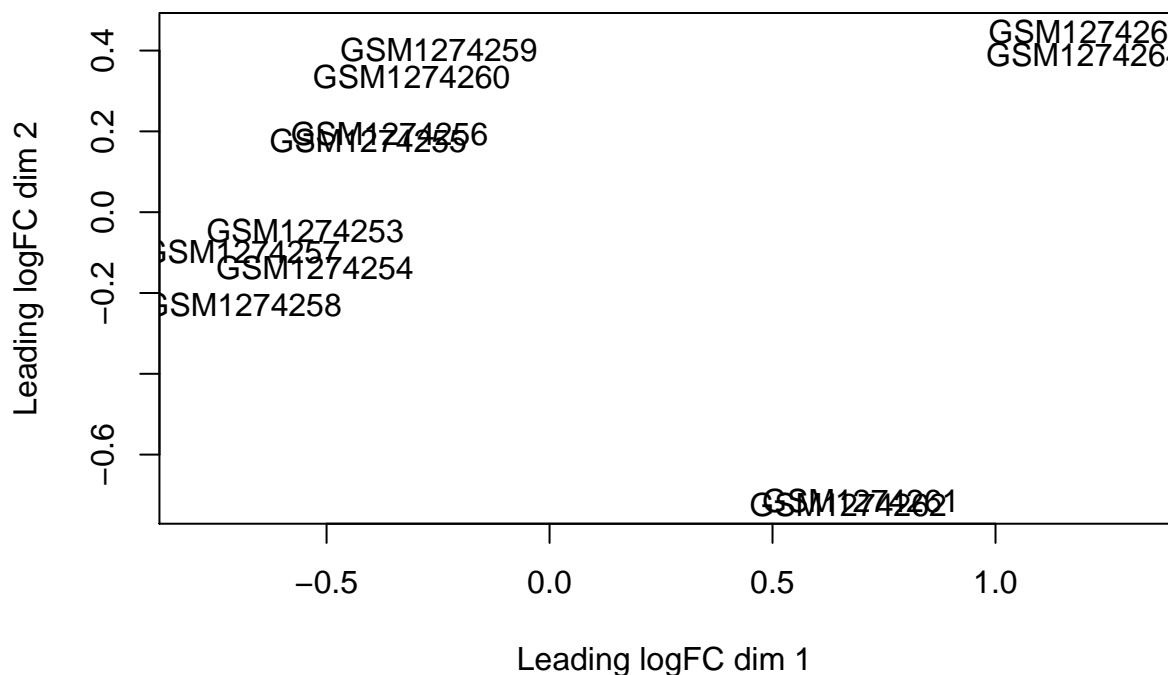
?plotMDS

Usage ## Default S3 method: plotMDS(x, top = 500, labels = NULL, pch = NULL, cex = 1, dim.plot = c(1,2), ndim = max(dim.plot), gene.selection = "pairwise", xlab = NULL, ylab = NULL, plot = TRUE, ...)  
## S3 method for class 'MDS' plotMDS(x, labels = NULL, pch = NULL, cex = 1, dim.plot = NULL, xlab = NULL, ylab = NULL, ...)

*#plot the data (MDS is like PCA)*

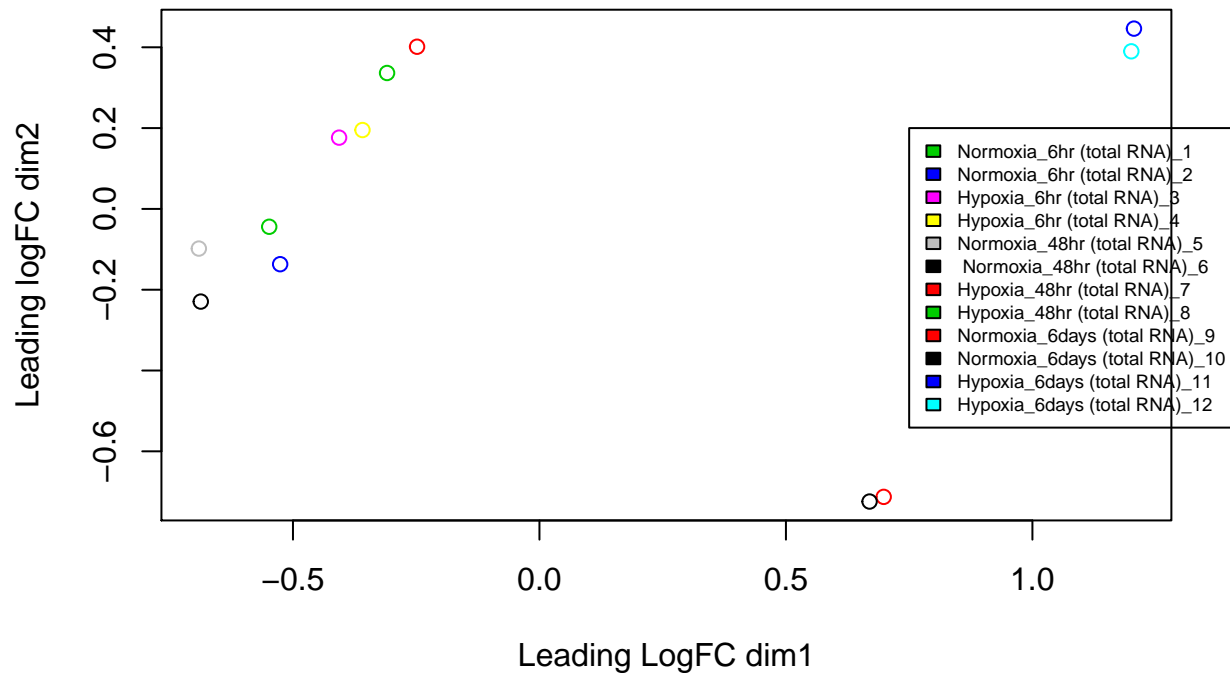
```
mds <- plotMDS(cds, main = "MDS Plot for Count Data", labels = colnames(cds$counts))
```

## MDS Plot for Count Data



```
plot(mds, main="MDS Plot for Count Data, clear view", xlab="Leading LogFC dim1", ylab="Leading logFC dim2",
par(xpd=TRUE)
legend(0.75,0.2,fill=keydf$treatment,legend=keydf$treatment,cex=0.6)
```

**MDS Plot for Count Data, clear view**



```
# title("Tx Status")
# library(car)
```

```
cds
```

```
## An object of class "DGEList"
```

```
## $counts
```

```
## GSM1274253 GSM1274254 GSM1274255 GSM1274256 GSM1274257 GSM1274258
## A1BG 0.262193 0.303420 0.339706 0.445281 0.514237 0.305903
## A1BG-AS1 0.970419 0.664858 1.053070 0.685633 0.645298 0.994222
## A2LD1 0.514254 0.417148 0.498825 0.653272 0.404583 0.502093
## AAAS 8.223290 7.361950 9.427670 7.773020 10.328000 10.390200
## AACS 5.169470 4.668560 5.389730 4.583680 4.632230 4.953550
## GSM1274259 GSM1274260 GSM1274261 GSM1274262 GSM1274263 GSM1274264
## A1BG 0.648874 0.656934 0.816547 0.916325 0.904315 1.03555
## A1BG-AS1 1.089420 0.996346 0.865717 0.837318 1.387640 1.51185
## A2LD1 0.516138 0.424641 1.396390 1.525380 0.929157 1.10681
## AAAS 10.274000 9.328310 7.662060 8.270740 6.487310 6.94087
## AACS 5.533260 5.850510 3.634350 3.553840 5.642410 5.87783
## 12157 more rows ...
```

```
##
```

```
## $samples
```

```
## group lib.size norm.factors
## GSM1274253 Normoxia 772461.6 0.8880870
## GSM1274254 Normoxia 603231.3 1.0442287
## GSM1274255 Hypoxia 618097.6 1.1320669
```

```

## GSM1274256 Hypoxia 615240.6    1.0903608
## GSM1274257 Normoxia 788218.0    0.8841033
## 7 more rows ...

#estimate variance, compute diff. exp
cds <- estimateCommonDisp( cds )
cds <- estimateTagwiseDisp( cds , prior.df = 10 ) #shrinks variance toward common disp.
de.tgw <- exactTest( cds , pair = c( "Normoxia" , "Hypoxia" ) ) #this is the DE test
options( digits = 3 ) # print only 3 digits
topTags( de.tgw , n = 20 , sort.by = "p.value" ) # print the top 20 DE genes, by p-value

## Comparison of groups: Hypoxia-Normoxia
##      logFC logCPM  PValue    FDR
## PFKFB4   3.37   4.19 3.73e-23 4.54e-19
## BNIP3    2.62   6.88 8.05e-17 4.90e-13
## SLC2A1    2.28   4.30 7.96e-16 3.23e-12
## HK2       1.83   5.06 1.08e-13 3.29e-10
## ADM       2.50   4.17 1.85e-13 4.49e-10
## ANGPTL4   3.11   3.75 2.43e-13 4.93e-10
## SLC16A3    1.90   4.86 4.07e-13 7.07e-10
## ANKZF1    1.77   4.47 2.99e-12 4.54e-09
## FAM162A   1.85   6.83 4.35e-12 5.88e-09
## AK4       1.77   4.42 5.46e-12 6.63e-09
## PFKP      1.87   5.17 1.50e-11 1.66e-08
## PGK1      1.53   7.94 1.67e-11 1.69e-08
## INSIG2    2.44   3.99 3.12e-11 2.91e-08
## P4HA2     1.80   5.13 3.39e-11 2.95e-08
## EGLN1     1.60   4.58 6.86e-11 5.56e-08
## PLOD2     2.32   4.99 7.53e-11 5.73e-08
## TMEM45A   2.25   4.19 4.06e-10 2.91e-07
## ENO2      2.24   5.72 8.25e-10 5.47e-07
## PPFIA4    3.33   3.14 8.55e-10 5.47e-07
## PFKFB3    1.49   4.44 2.25e-09 1.37e-06

resultsTbl.tgw <- topTags( de.tgw , n = nrow( de.tgw$table ) )$table
de.genes.tgw <- rownames( resultsTbl.tgw )[ resultsTbl.tgw$FDR <= 0.05 ]
length( de.genes.tgw ) # How many genes with significant DE?

## [1] 105

summary( decideTestsDGE( de.tgw , p.value = 0.05 ) ) # show Up and Down regulated genes

##      Normoxia+Hypoxia
## -1                1
## 0               12057
## 1                104

write.table(resultsTbl.tgw, file = "LiData_egerL.csv" , sep = "," , row.names = TRUE )

# xgenes <- cat(noquote(row.names(resultsTbl.tgw)), sep="\n")

```

Took list of top DE genes and used DAVID to find Gene Ontology and KEGG enriched functional groups. Went to website: <https://david.ncifcrf.gov/summary.jsp> Uploaded gene list, selected Homo sapiens:

I picked the top 225 genes, selected Homo sapiens, which narrowed the Gene List to 213 genes.

Here is an image of the process: Explored various ways to import the URL tab delim file.

**Step 1: Enter Gene List**

**A: Paste a list**

MTFP1  
HES4  
VWCE  
RNF24

Clear

Or

**B: Choose From a File**

Choose File

no file selected

☐ **Multi-List File** ?

**Step 2: Select Identifier**

OFFICIAL\_GENE\_SYMBOL

**Step 3: List Type**

Gene List ☒

Background ☐

**Step 4: Submit List**

Submit List

Figure 1: Pasting gene list.

## Gene List Manager

Select to limit annotations by one or more species [Help](#)

- Use All Species -  
 Homo sapiens(213)  
 Pan troglodytes(191)  
 Canis lupus familiaris(190)

Select Species

## List Manager [Help](#)

List\_1

Select List to:

Use    Rename  
 Remove    Combine  
 Show Gene List

[View Unmapped Ids](#)

## Annotation Summary Results

**Current Gene List: List\_1**  
**Current Background: Homo sapiens**

**213 DAVID IDs**  
**Check Defaults** ☒

Disease (1 selected)  
 Functional\_Categories (3 selected)  
 Gene\_Ontology (3 selected)  
 General\_Annotations (0 selected)  
 Literature (0 selected)  
 Main\_Accessions (0 selected)  
 Pathways (3 selected)  
 Protein\_Domains (3 selected)  
 Protein\_Interactions (0 selected)  
 Tissue\_Expression (0 selected)

\*\*\*Red annotation categories denote DAVID defined defaults\*\*\*

### Combined View for Selected Annotation

Functional Annotation Clustering  
 Functional Annotation Chart  
 Functional Annotation Table

Figure 2: Selecting species.



```
# ![Selecting species.](selectingspecies.png)
```

Current Gene List: List\_1 Current Background: Homo sapiens 213 DAVID IDs ——— Importing the functional\_annotation\_clustering for *Homo sapiens*

```
library(readr)
library(RCurl)
```

```
## Loading required package: bitops
```

```
URL <-"https://david.ncifcrf.gov/data/download/t2t_OC32396F8F541508972082264.txt"
```

```
# Final_Clustering <- read.table(URL, header=FALSE, sep="\t")
```

```
functional.annotaton.clustering.dat <- fread(URL, header=T)
```

```
## Warning in fread(URL, header = T): Starting data input on line 2 and
## discarding line 1 because it has too few or too many items to be column
## names or data: Annotation Cluster 1 Enrichment Score: 9.178650479827342

## Warning in fread(URL, header = T): Stopped reading at empty line 15 but
## text exists afterwards (discarded): Annotation Cluster 2 Enrichment Score:
## 4.539764866201056
```

```
head(functional.annotaton.clustering.dat)
```

```
##           Category                               Term Count    %
## 1: GOTERM_BP_DIRECT      GO:0061621~canonical glycolysis    14 6.57
## 2: GOTERM_BP_DIRECT      GO:0006096~glycolytic process    14 6.57
## 3:      UP_KEYWORDS                               Glycolysis    12 5.63
## 4:      KEGG_PATHWAY   hsa00010:Glycolysis / Gluconeogenesis    14 6.57
## 5:      BIOCARTA      h_glycolysisPathway:Glycolysis Pathway     7 3.29
## 6:      KEGG_PATHWAY                               hsa01200:Carbon metabolism    13 6.10
##      PValue
## 1: 1.68e-19
## 2: 1.38e-17
## 3: 3.48e-15
## 4: 1.57e-12
## 5: 1.07e-09
## 6: 1.68e-08
##
##                                     Genes
## 1: ALDOA, PFKL, PFKFB4, PFKFB3, ALDOC, HK2, PGAM1, PFKP, HK1, TPI1, ENO2, PGK1, GAPDH, ENO1
## 2:  ALDOA, LDHA, PFKL, ALDOC, HK2, PGAM1, HK1, TPI1, PGM1, ENO2, PGK1, GAPDH, EDARADD, ENO1
## 3:      ALDOA, TPI1, PFKL, ALDOC, ENO2, PGAM1, HK2, PFKP, HK1, PGK1, GAPDH, ENO1
## 4:      ALDOA, LDHA, PFKL, ALDOC, HK2, PGAM1, PFKP, HK1, TPI1, PGM1, ENO2, PGK1, GAPDH, ENO1
## 5:      TPI1, PFKL, PGAM1, HK1, PGK1, GAPDH, ENO1
## 6:      ALDOA, TPI1, PFKL, ALDOC, ENO2, PGAM1, HK2, PFKP, HK1, PGK1, GPT2, GAPDH, ENO1
##      List Total Pop Hits Pop Total Fold Enrichment Bonferroni Benjamini
## 1:      183      26    16792      49.41    1.65e-16    1.65e-16
## 2:      183      34    16792      37.78    1.36e-14    6.80e-15
## 3:      199      31    20581      40.03    8.29e-13    8.29e-13
## 4:       90      67     6910      16.04    2.22e-10    2.22e-10
## 5:       25      10     1625      45.50    6.66e-08    6.66e-08
## 6:       90     113     6910       8.83    2.36e-06    7.88e-07
##      FDR
## 1: 2.65e-16
## 2: 2.18e-14
```

```
## 3: 4.44e-12
## 4: 1.86e-09
## 5: 1.08e-06
## 6: 1.98e-05
```

Annotation Cluster 1		Enrichment Score: 9.18			Count	P_Value	Benjamini
<input type="checkbox"/>	GOTERM_BP_DIRECT	canonical glycolysis	RT		14	1.7E-19	1.7E-16
<input type="checkbox"/>	GOTERM_BP_DIRECT	glycolytic process	RT		14	1.4E-17	6.8E-15
<input type="checkbox"/>	UP_KEYWORDS	Glycolysis	RT		12	3.5E-15	8.3E-13
<input type="checkbox"/>	KEGG_PATHWAY	Glycolysis / Gluconeogenesis	RT		14	1.6E-12	2.2E-10
<input type="checkbox"/>	BIOCARTA	Glycolysis Pathway	RT		7	1.1E-9	6.7E-8
<input type="checkbox"/>	KEGG_PATHWAY	Carbon metabolism	RT		13	1.7E-8	7.9E-7
<input type="checkbox"/>	GOTERM_BP_DIRECT	gluconeogenesis	RT		9	2.1E-8	6.8E-6
<input type="checkbox"/>	KEGG_PATHWAY	Biosynthesis of amino acids	RT		11	2.7E-8	9.7E-7
<input type="checkbox"/>	KEGG_PATHWAY	Biosynthesis of antibiotics	RT		16	6.3E-8	1.8E-6
<input type="checkbox"/>	KEGG_PATHWAY	Metabolic pathways	RT		32	8.0E-5	1.4E-3
<input type="checkbox"/>	UP_SEQ_FEATURE	binding site:Substrate	RT		12	1.7E-4	2.8E-2
<input type="checkbox"/>	UP_SEQ_FEATURE	active site:Proton acceptor	RT		12	6.2E-2	9.4E-1

Figure 3: Example: Annotation Cluster 1

```
# functional.annotaton.clustering.dat <- read.csv(textConnection(myfile), header=F)
# head(functional.annotaton.clustering.dat)
```

Current Gene List: List\_1 Current Background: Homo sapiens 213 DAVID IDs ——— Importing the Functional Annotation Chart

```
URL2 <- "https://david.ncifcrf.gov/data/download/chart_OC32396F8F541508972594179.txt"
Functional_Annotation_Chart <- fread(URL2, header=T)
head(Functional_Annotation_Chart)
```

```
##          Category                                Term Count    %
## 1: GOTERM_BP_DIRECT      GO:0061621-canonical glycolysis    14 6.57
## 2: GOTERM_BP_DIRECT      GO:0006096-glycolytic process    14 6.57
## 3:      UP_KEYWORDS                                Glycolysis    12 5.63
## 4:      KEGG_PATHWAY      hsa00010:Glycolysis / Gluconeogenesis    14 6.57
## 5:      KEGG_PATHWAY      hsa00051:Fructose and mannose metabolism    10 4.69
## 6:      BIOCARTA          h_glycolysisPathway:Glycolysis Pathway     7 3.29
##          PValue
## 1: 1.68e-19
## 2: 1.38e-17
## 3: 3.48e-15
## 4: 1.57e-12
## 5: 1.42e-10
## 6: 1.07e-09
##
##                                     Genes
## 1: ALDOA, PFKL, PFKFB4, PFKFB3, ALDOC, HK2, PGAM1, PFKP, HK1, TPI1, ENO2, PGK1, GAPDH, ENO1
## 2: ALDOA, LDHA, PFKL, ALDOC, HK2, PGAM1, HK1, TPI1, PGM1, ENO2, PGK1, GAPDH, EDARADD, ENO1
## 3:      ALDOA, TPI1, PFKL, ALDOC, ENO2, PGAM1, HK2, PFKP, HK1, PGK1, GAPDH, ENO1
## 4:      ALDOA, LDHA, PFKL, ALDOC, HK2, PGAM1, PFKP, HK1, TPI1, PGM1, ENO2, PGK1, GAPDH, ENO1
## 5:      ALDOA, TPI1, MPI, PFKL, PFKFB4, PFKFB3, ALDOC, HK2, PFKP, HK1
## 6:      TPI1, PFKL, PGAM1, HK1, PGK1, GAPDH, ENO1
##      List Total Pop Hits Pop Total Fold Enrichment Bonferroni Benjamini
## 1:      183      26      16792      49.4      1.65e-16      1.65e-16
```

```
## 2:      183      34      16792      37.8      1.36e-14      6.80e-15
## 3:      199      31      20581      40.0      8.29e-13      8.29e-13
## 4:       90      67       6910      16.0      2.22e-10      2.22e-10
## 5:       90      32       6910      24.0      2.01e-08      1.00e-08
## 6:       25      10       1625      45.5      6.66e-08      6.66e-08
##      FDR
## 1: 2.65e-16
## 2: 2.18e-14
## 3: 4.44e-12
## 4: 1.86e-09
## 5: 1.68e-07
## 6: 1.08e-06
```

Functional Annotation Table Current Gene List: List\_1 Current Background: Homo sapiens 28387 DAVID IDs —

```
#importing functional annotation table
URL3 <- "https://david.ncifcrf.gov/data/download/tr_OC32396F8F541508973016208.txt"
myfile <- getURL(URL3, ssl.verifyhost=FALSE, ssl.verifypeer=FALSE)
Functional_Annotation_Table <- read.delim(textConnection(myfile), header=T, sep = "\t")
```

```
head(Functional_Annotation_Table)
```

```
##      ID
## 1    GBE1
## 2  PFKFB3
## 3  PFKFB4
## 4 ADPRHL2
## 5  ABCB6
## 6  BSPRY
```

```
##                                     Gene.Name
## 1                                1,4-alpha-glucan branching enzyme 1(GBE1)
## 2                6-phosphofructo-2-kinase/fructose-2,6-biphosphatase 3(PFKFB3)
## 3                6-phosphofructo-2-kinase/fructose-2,6-biphosphatase 4(PFKFB4)
## 4                                ADP-ribosylhydrolase like 2(ADPRHL2)
## 5 ATP binding cassette subfamily B member 6 (Langereis blood group)(ABCB6)
## 6                B-box and SPRY domain containing(BSPRY)
```

```
##      Species BBID BIOCARTA
## 1 Homo sapiens
## 2 Homo sapiens
## 3 Homo sapiens
## 4 Homo sapiens
## 5 Homo sapiens
## 6 Homo sapiens
```

```
##                                     COG_ONTOLOGY
## 1                Carbohydrate transport and metabolism,
## 2
## 3
## 4
## 5 Posttranslational modification, protein turnover, chaperones,
## 6
```

```
##
## 1
## 2                GO:0006000~fructose metabolic process,GO:0006003~fructose 2,6-bisphosphate meta
## 3                GO:0006000~fructose metabolic process,GO:0006003~f
```

```

## 4
## 5 GO:0006779~porphyrin-containing compound biosynthetic process,GO:0006810~transport,GO:0006879~cell
## 6
##
## 1
## 2
## 3
## 4
## 5 GO:0000139~Golgi membrane,GO:0005739~mitochondrion,GO:0005740~mitochondrial envelope,GO:0005741~mi
## 6
##
## 1
## 2
## 3
## 4
## 5 GO:0005524~ATP binding,GO:0015232~heme transporter activity,GO:0015439~heme-transporting ATPase ac
## 6
##
## 1 IPR004193:Glycoside hydrolase, family 13, N-terminal,IPR006047:Glycosyl hydrolase, family 13, cata
## 2
## 3
## 4
## 5
## 6
##
##
## 1
## 2 hsa00051:Fructose and mannose metabolism,hsa04066:HIF-1 signaling pathway,hsa04152:AMPK signaling p
## 3 hsa00051:Fructose and mannose metabolism,hsa04152:AMPK signaling p
## 4
## 5
## 6 hsa02010:ABC transp
##
## 1
## 2
## 3
## 4
## 5 111600~Blood group, Langereis system,609153~Pseudohyperkalemia, familial, 2, due to red cell leak,
## 6
##
## 1 PIR_SUPERFAMILY SMART
## 2 PIRSF000463:1,4-alpha-glucan branching enzyme, SM00642:Amy,
## 3 SM00855:SM00855,
## 4 SM00855:SM00855,
## 5
## 6 SM00382:AAA,
SM00449:SPRY,SM00589:PRY,
##
## 1
## 2
## 3
## 4
## 5 3D-structure,Alternative splicing,ATP-binding,Cell membrane,Complete proteome,Disease mutation,Dysl
## 6
##
## 1

```

## 2 active site:Proton donor,active site:Tele-phosphohistidine intermediate,binding site:Fructose-6-ph  
## 3 active site:Proton donor,active site:Tele-phosphohistidine inter  
## 4  
## 5  
## 6