Dysregulated processes in NAFLD (BB103X)

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Introduction

One common way for searching shared functions among genes is to incorporate the biological knowledge provided by biological ontologies. For instance, 1)Gene Ontology (GO) (Ashburner et al., 2000) annotates genes to biological processes, molecular functions, and cellular components in a directed acyclic graph structure, 2)Kyoto Encyclopedia of Genes and Genomes (KEGG) (Kanehisa et al., 2010) annotates genes to pathways, 3) Disease Ontology (DO) annotates genes with human disease association (Osborne et al., 2009).

The clusterProfiler package is implemented for gene cluster comparison. clusterProfiler applies biological term classification and enrichment analyses to gene cluster comparison, helping to better understand higher order functions of biological system.

Read paper Yu, Guangchuang, et al. Omics: a journal of integrative biology 16.5 (2012): 284-287.

3.1 Load necessary packages

• Rstudio

```
library(DESeq2)
library(pheatmap)
library(tidyverse)
library(xlsx)
library(readxl)
library(gplots)
library(ggbiplot)
library(piano)
library(venn)
library(ggpubr)
library(clusterProfiler)
library(GEOquery)
library(MAGeCKFlute)
library(openxlsx)
library(GEOquery)
library(ggrepel)
library(DOSE)
library(org.Hs.eg.db)
library(VennDiagram)
```

3.2 Load data from differential analysis

```
### Set 1: Deseq results between NAFL/NASH and control
deseq_data1 = read.xlsx('data/DEseq_results_NAFLvscontrol.xlsx')
deseq_data2 = read.xlsx('data/DEseq_results_NASH_FO-F1vscontrol.xlsx')
```

```
deseq_data3 = read.xlsx('data/DEseq_results_NASH_F2vscontrol.xlsx')
deseq_data4 = read.xlsx('data/DEseq_results_NASH_F3vscontrol.xlsx')
deseq_data5 = read.xlsx('data/DEseq_results_NASH_F4vscontrol.xlsx')
deseq_data1[1:6,c(2,5:7)]
## log2FoldChange pvalue padj Gene.name
```

```
## 1
        -0.01490257 0.986911009 0.99227207
                                                TNMD
## 2
        0.03269755 0.811729476 0.88807235
                                                DPM1
## 3
        -0.07917556 0.351573381 0.49338748
                                               SCYL3
## 4
       -0.48628837 0.007193552 0.02032398 Clorf112
## 5
       -0.16389423 0.366075834 0.50859810
                                                 FGR
        0.39738106 0.009943955 0.02670424
## 6
                                                  CFH
```

3.3 Basic statistic - differential expressed gene

- padj < 0.05
- log2FoldChange > 1 or log2FoldChange < -1

```
deseq_data_sig1 = deseq_data1 %>%
  mutate(sig = case_when((padj < 0.05 & log2FoldChange < -1) ~ "Down",</pre>
                          (padj < 0.05 & log2FoldChange > 1) ~ "Up",
                          TRUE ~ "No")) %>%
 filter(!(sig == 'No'))
deseq_data_sig2 = deseq_data2 %>%
 mutate(sig = case_when((padj < 0.05 & log2FoldChange < -1) ~ "Down",</pre>
                          (padj < 0.05 & log2FoldChange > 1) ~ "Up",
                          TRUE ~ "No")) %>%
  filter(!(sig == 'No'))
deseq_data_sig3 = deseq_data3 %>%
  mutate(sig = case_when((padj < 0.05 & log2FoldChange < -1) ~ "Down",</pre>
                          (padj < 0.05 & log2FoldChange > 1) ~ "Up",
                          TRUE ~ "No")) %>%
  filter(!(sig == 'No'))
deseq data sig4 = deseq data4 %>%
  mutate(sig = case_when((padj < 0.05 & log2FoldChange < -1) ~ "Down",</pre>
                          (padj < 0.05 & log2FoldChange > 1) ~ "Up",
                          TRUE ~ "No")) %>%
 filter(!(sig == 'No'))
deseq_data_sig5 = deseq_data5 %>%
  mutate(sig = case_when((padj < 0.05 & log2FoldChange < -1) ~ "Down",</pre>
                          (padj < 0.05 & log2FoldChange > 1) ~ "Up",
                          TRUE ~ "No")) %>%
 filter(!(sig == 'No'))
deseq_data_sig1[1:6,c(2,5:8)]
```

```
log2FoldChange
##
                          pvalue
                                         padj Gene.name
                                                         sig
## 1
           4.333222 6.167344e-16 4.353204e-14
                                                CYP51A1
                                                          Uр
           1.090650 9.741048e-08 1.009119e-06
## 2
                                                 MAD1L1
                                                          Uр
           1.182610 1.102249e-05 6.851220e-05
## 3
                                                 DBNDD1
                                                          Uр
```

3.4 summary - differential expressed gene

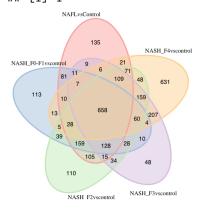
```
table(deseq_data_sig1$sig)
##
## Down Up
## 827 726
```

Venn digram of differentially expressed genes.

• VennDiagram

```
DEG_list = list()
DEG_list[[1]] = deseq_data_sig1$Gene.name
DEG_list[[2]] = deseq_data_sig2$Gene.name
DEG_list[[3]] = deseq_data_sig3$Gene.name
DEG_list[[4]] = deseq_data_sig4$Gene.name
DEG_list[[5]] = deseq_data_sig5$Gene.name
venn.diagram(DEG_list, category.names = c("NAFLvsControl",
                                           "NASH_F0-F1vscontrol",
                                           "NASH F2vscontrol",
                                           "NASH F3vscontrol",
                                           "NASH F4vscontrol"),
             filename = 'Figures/01_venn_diagramm_DEGs.png',
             output = TRUE ,
             imagetype="png", height = 480, width = 480, resolution = 300, compression = "lzw", lwd = 1
             col=c("#fbb4ae", '#b3cde3', '#ccebc5', '#decbe4', '#fed9a6'),
             fill = c("#fbb4ae", '#b3cde3', '#ccebc5', '#decbe4', '#fed9a6'),
             cex = 0.3,fontfamily = "sans",cat.cex = 0.3,
             cat.default.pos = "outer", cat.pos = c(-27, 4, 140, 170, 6))
```

[1] 1

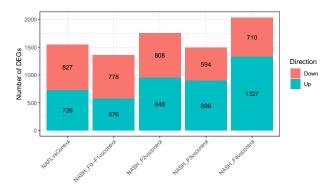


3.4 Bar plot shows the number of DEGs at each comparison

• basic summary

```
##
      Var1 Freq
                               comp
## 1
     Down 827
                      NAFLvsControl
                      NAFLvsControl
## 2
        Uр
            726
## 3 Down
           778 NASH_F0-F1vscontrol
## 4
       Uр
            576 NASH_FO-F1vscontrol
## 5
           808
                   NASH_F2vscontrol
     Down
## 6
       Uр
           948
                   NASH_F2vscontrol
## 7
     Down 594
                   NASH_F3vscontrol
## 8
        Up
           899
                   NASH F3vscontrol
## 9
     Down 710
                   NASH_F4vscontrol
       Up 1327
                   NASH_F4vscontrol
## 10
```

• Visualization



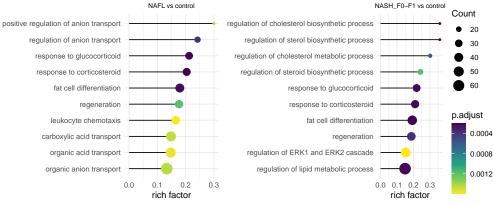
3.4 GO enrichment - differential expressed gene

• GO ontology enrichment

```
pvalueCutoff = 0.01,
               qvalueCutoff = 0.05)
ego_bp2 <- enrichGO(gene
                              = deseq_data_sig2$Gene.name,
               OrgDb
                           = org.Hs.eg.db,
               keyType
                           = 'SYMBOL',
                            = "BP",
               ont
               pAdjustMethod = "BH",
               pvalueCutoff = 0.01,
               qvalueCutoff = 0.05)
ego_bp3 <- enrichGO(gene
                              = deseq_data_sig3$Gene.name,
                           = org.Hs.eg.db,
               OrgDb
               keyType
                           = 'SYMBOL',
                           = "BP",
               ont
               pAdjustMethod = "BH",
               pvalueCutoff = 0.01,
               qvalueCutoff = 0.05)
ego_bp4 <- enrichGO(gene
                              = deseq_data_sig4$Gene.name,
               OrgDb
                           = org.Hs.eg.db,
               keyType
                           = 'SYMBOL',
               ont
                            = "BP",
               pAdjustMethod = "BH",
               pvalueCutoff = 0.01,
               qvalueCutoff = 0.05)
ego_bp5 <- enrichGO(gene
                              = deseq_data_sig5$Gene.name,
                           = org.Hs.eg.db,
               OrgDb
               keyType
                           = 'SYMBOL',
                            = "BP",
               ont
               pAdjustMethod = "BH",
               pvalueCutoff = 0.01,
               qvalueCutoff = 0.05)
list_ego = list('NAFLvsControl' = ego_bp1, 'NASH_FO-F1vscontrol' = ego_bp2,
                'NASH_F2vscontrol' = ego_bp3, 'NASH_F3vscontrol' = ego_bp4, 'NASH_F4vscontrol' = ego_bp
write.xlsx(list_ego, file = 'data/GO_BP_enrichment.NAFLorNASHvsControl.xlsx')
y1 <- mutate(ego_bp1, richFactor = Count / as.numeric(sub("/\\d+", "", BgRatio)))
y1_p = ggplot(y1, showCategory = 10,
  aes(richFactor, fct_reorder(Description, richFactor))) +
  geom_segment(aes(xend=0, yend = Description)) +
  geom_point(aes(color=p.adjust, size = Count)) +
  scale_color_viridis_c(guide=guide_colorbar(reverse=TRUE)) +
  scale_size_continuous(range=c(1, 6)) +
  theme_minimal() +
 xlab("rich factor") +
```

```
ylab(NULL) + ggtitle('NAFL vs control') + ggeasy::easy_center_title() + ggeasy::easy_plot_title_size(')
y2 <- mutate(ego_bp2, richFactor = Count / as.numeric(sub("/\\d+", "", BgRatio)))

y2_p = ggplot(y2, showCategory = 10,
    aes(richFactor, fct_reorder(Description, richFactor))) +
    geom_segment(aes(xend=0, yend = Description)) +
    geom_point(aes(color=p.adjust, size = Count)) +
    scale_color_viridis_c(guide=guide_colorbar(reverse=TRUE)) +
    scale_size_continuous(range=c(1, 6)) +
    theme_minimal() +
    xlab("rich factor") +
    ylab(NULL) + ggtitle('NASH_F0-F1 vs control') + ggeasy::easy_center_title() + ggeasy::easy_plot_title
y1andy2 = ggarrange(y1_p, y2_p, ncol = 2, common.legend = TRUE, legend = 'right')
ggsave(y1andy2, filename = 'Figures/02-goEnrichr-NAFL&NASHfOf1vsControl.pdf', width = 8.5, height = 3.5</pre>
```



3.4 KEGG enrichment - differential expressed gene

• KEGG pathway enrichment

```
## Reading KEGG annotation online:
##
## Reading KEGG annotation online:
rm(entrezID, deseq_data_sig_withID, geneList, gene)
### NASH_FO-F1 vs Control
entrezID <- TransGeneID(deseq_data_sig2$Gene.name,</pre>
                        fromType = "Symbol",
                        toType = "Entrez",
                        organism = "hsa")
entrezID = as.data.frame(entrezID) %>% mutate(Gene.name = rownames(.))
rownames(deseq_data_sig2) = deseq_data_sig2$Gene.name
deseq_data_sig_withID = merge(deseq_data_sig2, entrezID, by = 'Gene.name')
geneList = deseq_data_sig_withID$log2FoldChange
names(geneList) = as.character(deseq_data_sig_withID$entrezID)
geneList = sort(geneList, decreasing = TRUE)
gene <- names(geneList)[abs(geneList) > 2]
kk2 <- enrichKEGG(gene
                          = gene,
                 organism = 'hsa',
                 pvalueCutoff = 0.05)
rm(entrezID, deseq_data_sig_withID, geneList, gene)
### NASH F2 vs Control
entrezID <- TransGeneID(deseq_data_sig3$Gene.name,</pre>
                        fromType = "Symbol",
                        toType = "Entrez",
                        organism = "hsa")
entrezID = as.data.frame(entrezID) %>% mutate(Gene.name = rownames(.))
rownames(deseq_data_sig3) = deseq_data_sig3$Gene.name
deseq_data_sig_withID = merge(deseq_data_sig3, entrezID, by = 'Gene.name')
geneList = deseq_data_sig_withID$log2FoldChange
names(geneList) = as.character(deseq_data_sig_withID$entrezID)
geneList = sort(geneList, decreasing = TRUE)
gene <- names(geneList)[abs(geneList) > 2]
kk3 <- enrichKEGG(gene
                          = gene,
                 organism = 'hsa',
                 pvalueCutoff = 0.05)
rm(entrezID, deseq_data_sig_withID, geneList, gene)
### NASH_F3 vs Control
entrezID <- TransGeneID(deseq_data_sig4$Gene.name,</pre>
                        fromType = "Symbol",
                        toType = "Entrez",
```

pvalueCutoff = 0.05)

```
organism = "hsa")
entrezID = as.data.frame(entrezID) %>% mutate(Gene.name = rownames(.))
rownames(deseq_data_sig4) = deseq_data_sig4$Gene.name
deseq_data_sig_withID = merge(deseq_data_sig4, entrezID, by = 'Gene.name')
geneList = deseq_data_sig_withID$log2FoldChange
names(geneList) = as.character(deseq data sig withID$entrezID)
geneList = sort(geneList, decreasing = TRUE)
gene <- names(geneList)[abs(geneList) > 2]
kk4 <- enrichKEGG(gene
                          = gene,
                 organism = 'hsa',
                 pvalueCutoff = 0.05)
rm(entrezID, deseq_data_sig_withID, geneList, gene)
### NASH_F4 vs Control
entrezID <- TransGeneID(deseq_data_sig5$Gene.name,</pre>
                        fromType = "Symbol",
                        toType = "Entrez",
                        organism = "hsa")
entrezID = as.data.frame(entrezID) %>% mutate(Gene.name = rownames(.))
rownames(deseq_data_sig5) = deseq_data_sig5$Gene.name
deseq data sig withID = merge(deseq data sig5, entrezID, by = 'Gene.name')
geneList = deseq_data_sig_withID$log2FoldChange
names(geneList) = as.character(deseq_data_sig_withID$entrezID)
geneList = sort(geneList, decreasing = TRUE)
gene <- names(geneList)[abs(geneList) > 2]
kk5<- enrichKEGG(gene
                        = gene,
                 organism = 'hsa',
                 pvalueCutoff = 0.05)
list_kk = list('NAFLvsControl' = kk1, 'NASH_FO-F1vscontrol' = kk2,
                'NASH_F2vscontrol' = kk3, 'NASH_F3vscontrol' = kk4, 'NASH_F4vscontrol' = kk5)
write.xlsx(list_kk, file = 'data/KEGG_pathway_enrichment.NAFLorNASHvsControl.xlsx')
y1 <- mutate(kk1, richFactor = Count / as.numeric(sub("/\\d+", "", BgRatio)))
y1_p = ggplot(y1, showCategory = 10,
  aes(richFactor, fct_reorder(Description, richFactor))) +
  geom_segment(aes(xend=0, yend = Description)) +
  geom point(aes(color=p.adjust, size = Count)) +
  scale_color_viridis_c(guide=guide_colorbar(reverse=TRUE)) +
  scale_size_continuous(range=c(1, 6)) +
  theme_minimal() +
  xlab("rich factor") +
  ylab(NULL) + ggtitle('NASH F0-F1 vs control') + ggeasy::easy center title() + ggeasy::easy plot title
y2 <- mutate(kk2, richFactor = Count / as.numeric(sub("/\\d+", "", BgRatio)))
```

p.adiust

0.010

3.4 disease enrichment - differential expressed gene

• disease enrichment

C-type lectin receptor signaling pathway =

Alcoholic liver disease -

```
entrezID <- TransGeneID(deseq_data_sig1$Gene.name,</pre>
                       fromType = "Symbol",
                       toType = "Entrez",
                       organism = "hsa")
entrezID = as.data.frame(entrezID) %>% mutate(Gene.name = rownames(.))
rownames(deseq_data_sig1) = deseq_data_sig1$Gene.name
deseq_data_sig_withID = merge(deseq_data_sig1, entrezID, by = 'Gene.name')
geneList = deseq_data_sig_withID$log2FoldChange
names(geneList) = as.character(deseq_data_sig_withID$entrezID)
geneList = sort(geneList, decreasing = TRUE)
gene <- names(geneList)[abs(geneList) > 2]
dd1 <- enrichD0(gene
                           = gene,
                          = "DO",
             ont
             pvalueCutoff = 0.05,
             pAdjustMethod = "BH",
             universe = names(geneList),
             minGSSize
                         = 5,
             maxGSSize = 500,
             qvalueCutoff = 0.05,
             readable = FALSE)
rm(entrezID, deseq_data_sig_withID, geneList, gene)
```

```
### NASH FO-F1 vs Control
entrezID <- TransGeneID(deseq_data_sig2$Gene.name,</pre>
                       fromType = "Symbol",
                       toType = "Entrez",
                       organism = "hsa")
entrezID = as.data.frame(entrezID) %>% mutate(Gene.name = rownames(.))
rownames(deseq_data_sig2) = deseq_data_sig2$Gene.name
deseq_data_sig_withID = merge(deseq_data_sig2, entrezID, by = 'Gene.name')
geneList = deseq_data_sig_withID$log2FoldChange
names(geneList) = as.character(deseq_data_sig_withID$entrezID)
geneList = sort(geneList, decreasing = TRUE)
gene <- names(geneList)[abs(geneList) > 2]
dd2 <- enrichDO(gene
                           = gene,
             ont
                         = "DO",
             pvalueCutoff = 0.05,
             pAdjustMethod = "BH",
             universe = names(geneList),
             minGSSize
                          = 5,
             maxGSSize = 500,
             qvalueCutoff = 0.05,
             readable = FALSE)
rm(entrezID, deseq_data_sig_withID, geneList, gene)
### NASH_F2 vs Control
entrezID <- TransGeneID(deseq_data_sig3$Gene.name,</pre>
                       fromType = "Symbol",
                       toType = "Entrez",
                       organism = "hsa")
entrezID = as.data.frame(entrezID) %>% mutate(Gene.name = rownames(.))
rownames(deseq_data_sig3) = deseq_data_sig3$Gene.name
deseq_data_sig_withID = merge(deseq_data_sig3, entrezID, by = 'Gene.name')
geneList = deseq_data_sig_withID$log2FoldChange
names(geneList) = as.character(deseq_data_sig_withID$entrezID)
geneList = sort(geneList, decreasing = TRUE)
gene <- names(geneList)[abs(geneList) > 2]
dd3 <- enrichDO(gene
                            = gene,
                         = "DO",
             pvalueCutoff = 0.05,
             pAdjustMethod = "BH",
             universe = names(geneList),
             minGSSize = 5,
             maxGSSize = 500,
             qvalueCutoff = 0.05,
             readable
                         = FALSE)
rm(entrezID, deseq_data_sig_withID, geneList, gene)
### NASH_F3 vs Control
```

```
entrezID <- TransGeneID(deseq_data_sig4$Gene.name,</pre>
                       fromType = "Symbol",
                       toType = "Entrez",
                       organism = "hsa")
entrezID = as.data.frame(entrezID) %>% mutate(Gene.name = rownames(.))
rownames(deseq_data_sig4) = deseq_data_sig4$Gene.name
deseq_data_sig_withID = merge(deseq_data_sig4, entrezID, by = 'Gene.name')
geneList = deseq_data_sig_withID$log2FoldChange
names(geneList) = as.character(deseq_data_sig_withID$entrezID)
geneList = sort(geneList, decreasing = TRUE)
gene <- names(geneList)[abs(geneList) > 2]
dd4 <- enrichDO(gene
                            = gene,
             ont.
                           = "DO",
             pvalueCutoff = 0.05,
             pAdjustMethod = "BH",
             universe = names(geneList),
             minGSSize
                         = 5,
             maxGSSize = 500.
             qvalueCutoff = 0.05,
             readable = FALSE)
rm(entrezID, deseq_data_sig_withID, geneList, gene)
### NASH F4 vs Control
entrezID <- TransGeneID(deseq_data_sig5$Gene.name,</pre>
                       fromType = "Symbol",
                       toType = "Entrez",
                       organism = "hsa")
entrezID = as.data.frame(entrezID) %>% mutate(Gene.name = rownames(.))
rownames(deseq_data_sig5) = deseq_data_sig5$Gene.name
deseq_data_sig_withID = merge(deseq_data_sig5, entrezID, by = 'Gene.name')
geneList = deseq_data_sig_withID$log2FoldChange
names(geneList) = as.character(deseq_data_sig_withID$entrezID)
geneList = sort(geneList, decreasing = TRUE)
gene <- names(geneList)[abs(geneList) > 2]
dd5 <- enrichDO(gene
                            = gene,
                          = "DO",
             pvalueCutoff = 0.05,
             pAdjustMethod = "BH",
             universe = names(geneList),
             minGSSize
                         = 5,
             maxGSSize = 500,
             qvalueCutoff = 0.05,
             readable = FALSE)
rm(entrezID, deseq_data_sig_withID, geneList, gene)
list_dd= list('NAFLvsControl' = dd1, 'NASH_F0-F1vscontrol' = dd2,
               'NASH_F2vscontrol' = dd3, 'NASH_F3vscontrol' = dd4, 'NASH_F4vscontrol' = dd5)
```

```
write.xlsx(list_dd, file = 'data/Disease_enrichment.NAFLorNASHvsControl.xlsx')

y <- mutate(dd1, richFactor = Count / as.numeric(sub("/\\d+", "", BgRatio)))

ggplot(y, showCategory = 20,
   aes(richFactor, fct_reorder(Description, richFactor))) +
   geom_segment(aes(xend=0, yend = Description)) +
   geom_point(aes(color=p.adjust, size = Count)) +
   scale_color_viridis_c(guide=guide_colorbar(reverse=TRUE)) +
   scale_size_continuous(range=c(1, 6)) +
   theme_minimal() +
   xlab("rich factor") +
   ylab(NULL) +
   ggtitle("Enriched Disease Ontology")</pre>
```

