P259: Publication figures and tables Dendritic cells (pDC)

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#Create directories of outputs	
<pre>dir.create("publication/fig/", showWarnings = FALSE, recursive = TRUE)</pre>	
<pre>dir.create("publication/table/", showWarnings = FALSE, recursive = TRUE)</pre>	
#Load packages used across all data	
library(tidyverse)	
library(limma)	
#Set seed	
set.seed(4389)	

Tables

RNA-seq library and patient metadata

```
attach("data_clean/P259_pDC_clean.RData")

dat.pDC.voom$targets %>%
   select(libID, everything()) %>%
   arrange(libID) %>%
   write_csv(., "publication/table/TableS.metadata.csv")
```

Patient summary demographics

```
dat.pDC.voom$targets %>%
 distinct(experiment, donorID, Age) %>%
 group_by(experiment) %>%
 summarise(.groups = "keep",
          n = n(),
          mean.age = mean(Age, na.rm=TRUE),
          sd.age = sd(Age, na.rm=TRUE)/sqrt(n))
## # A tibble: 2 x 4
## # Groups: experiment [2]
##
    experiment n mean.age sd.age
    <chr> <int> <dbl> <dbl>
## 1 P259 1
                 4
                      28
                            2.83
## 2 P259 2
                      12.9 0.738
#Sex
dat.pDC.voom$targets %>%
 distinct(experiment, donorID, Sex) %>%
 count(experiment, Sex) %>%
 group_by(experiment) %>%
 mutate(pct = n/sum(n))
## # A tibble: 5 x 4
## # Groups: experiment [2]
   experiment Sex
                      n pct
   <chr> <chr> <int> <dbl>
## 1 P259_1 Female 1 0.25
## 2 P259 1 Male
                      1 0.25
## 3 P259 1 <NA>
                      2 0.5
```

RNA-seq normalized log2 counts

```
#attach("data_clean/P259_pDC_clean.RData")
as.data.frame(dat.pDC.voom$E) %>%
   rownames_to_column("geneName") %>%
#Save
write_csv(., "publication/table/TableS.norm.log2.counts.csv")
```

All contrast model results

```
#Get all model results
read_csv("results/gene_level/P259.1_gene_pval.csv") %>%
  #Add experiment variable
mutate(experiment = "P259_1") %>%
bind_rows(read_csv("results/gene_level/P259.2_gene_pval.csv")) %>%
#Fill in experiment variable
mutate(experiment = ifelse(is.na(experiment), "P259_2", experiment)) %>%
#Keep only contrasts model
```

GSEA results

```
read csv("results/GSEA FoldChange/h GSEA.result.csv") %>%
 rename(contrast = group) %>%
  #Add experiment variable
  mutate(experiment = ifelse(grep1(".1", contrast), "P259_1", "P259_2")) %>%
  #Set gene set variable
  mutate(gene.set = "HALLMARK",
        pathway = gsub("HALLMARK_", "", pathway)) %>%
  #Format contrast to match model results
  mutate(contrast = gsub(".1", "", contrast),
        contrast = gsub(".2", "", contrast),
        contrast = gsub("[.]n"," - n", contrast),
        contrast = gsub("[.]A"," - A", contrast),
         contrast = gsub("[.]E"," - E", contrast)) %>%
  #Reorder variables
  select(experiment, gene.set, pathway, contrast, everything()) %>%
  arrange(experiment, pathway, contrast) %>%
write csv(., "publication/table/TableS.GSEA.csv")
```

Figures

PCA

```
library(cowplot)
```

Calculate PCA for P259.1 and P259.2

Combine experiments and metadata.

```
# Extract PC values
PCA.dat <- as.data.frame(PCA1$x) %>%
   rownames_to_column("libID") %>%
   bind_rows(rownames_to_column(as.data.frame(PCA2$x),"libID")) %>%
# Select PCs
dplyr::select(libID, PC1, PC2) %>%
# Merge with metadata
left_join(dat.pDC.voom$targets, by="libID")
```

Plot PCAs

```
#Define ggplot colors
group.cols <- c("none:none"="#dadaeb",</pre>
                "none:AntiIL5"="#9e9ac8",
                "none: EOS. supp"="#54278f",
                "HRV:none"="#c7e9c0",
                "HRV: AntiIL5"="#74c476",
                "HRV:EOS.supp"="#006d2c",
                "flu:none"="#fdae6b",
                "flu:AntiIL5"="#e6550d")
PCA1 <- PCA.dat %>%
  filter(experiment=="P259_1") %>%
  ggplot(aes(PC1, PC2, color=virus:IL5)) +
  geom_point(size=5) +
  #Beautify
  theme_classic(base_size = 16) +
  labs(x=PC1.label1, y=PC2.label1) +
  coord_fixed(ratio=1) +
  scale_color_manual(values = group.cols,
                     labels = c("media", "+ EOS sup",
                              "+ RV", "+ RV + EOS sup"),
                     name="") +
  theme(legend.position = "bottom") +
  guides(color=guide_legend(nrow=2))
PCA2 <- PCA.dat %>%
  filter(experiment=="P259_2") %>%
  ggplot(aes(PC1, PC2, color=virus:IL5)) +
```

```
geom_point(size=5) +
  #Beautify
  theme_classic(base_size = 16) +
  labs(x=PC1.label2, y=PC2.label2) +
  coord_fixed(ratio=1) +
  scale_color_manual(values = group.cols,
                     labels = c("media", "+ Anti-IL5",
                                "+ RV", "+ RV + Anti-IL5"),
                     name="") +
  theme(legend.position = "bottom") +
  guides(color=guide_legend(nrow=2))
plot_grid(PCA1,PCA2, align = "hv", labels = c("A","B"))
Α
                                              В
    80
                                                  50
PC2 (16.2%)
    40
     0
                                                   0
   -40
                                                 -50
        -100
                  -50
                            0
                                     50
                                                        -150
                                                                -100
                                                                         -50
                                                                                 0
                                                                                        50
                   PC1 (21.2%)
                                                                 PC1 (19.4%)
                         + RV
                                                                       + RV
          media
                                                            media
             + EOS sup • + RV + EOS sup
                                                            + Anti-IL5   + RV + Anti-IL5
#Save
ggsave("publication/fig/PCA.pdf",
       plot_grid(PCA1,PCA2, align = "hv", labels = c("A", "B")),
       width=10, height=5)
```

Contrast model venn

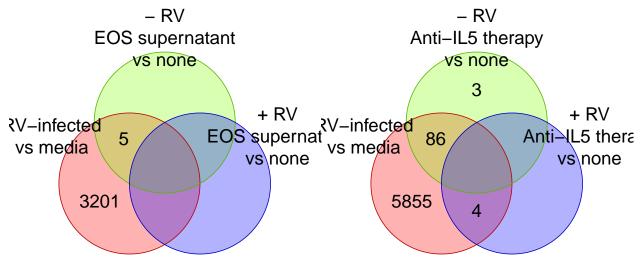
```
library(venn)
```

Genes significant for contrasts at FDR < 0.2

```
#Load pvalue results
pval_1 <- read_csv("results/gene_level/P259.1_gene_pval.csv") %>%
  filter(model == "contrasts")
pval_2 <- read_csv("results/gene_level/P259.2_gene_pval.csv") %>%
  filter(model == "contrasts")

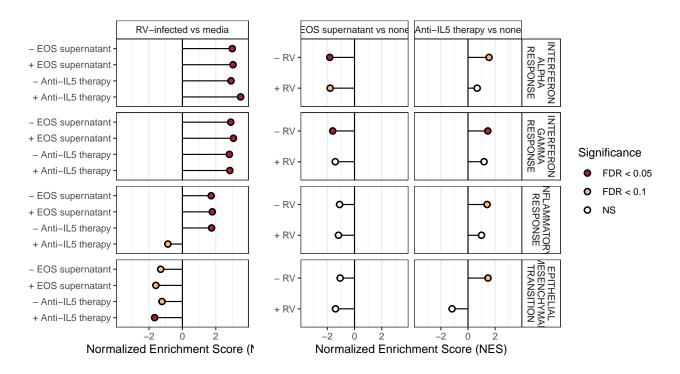
#Set FDR cutoff
fdr.list <- c(0.2)</pre>
```

```
#Plot venns
for(fdr.cutoff in fdr.list){
  #P259.1
  venn.list_1 <- list()</pre>
  ##Signif for virus
  venn.list_1[["RV-infected\nvs media"]] <- pval_1 %>%
   filter(group %in% c("none_HRV - none_none",
                        "EOS.supp_HRV - EOS.supp_none") &
             adj.P.Val <= fdr.cutoff) %>%
    distinct(geneName) %>%
    select(geneName) %>% unlist(use.names = FALSE)
  ##Signif for treatment
  venn.list_1[["- RV\nEOS supernatant\nvs none"]] <- pval_1 %>%
   filter(group == "EOS.supp_none - none_none" &
             adj.P.Val <= fdr.cutoff) %>%
   distinct(geneName) %>%
    select(geneName) %>% unlist(use.names = FALSE)
  venn.list_1[["+ RV\nEOS supernatant\nvs none"]] <- pval_1 %>%
    filter(group == "EOS.supp_HRV - none_HRV" &
             adj.P.Val <= fdr.cutoff) %>%
   distinct(geneName) %>%
   select(geneName) %>% unlist(use.names = FALSE)
  #P259.2
  venn.list_2 <- list()</pre>
  ##Signif for virus
  venn.list_2[["RV-infected\nvs media"]] <- pval_2 %>%
   filter(group %in% c("none_HRV - none_none",
                        "AntiIL5_HRV - AntiIL5_none") &
             adj.P.Val <= fdr.cutoff) %>%
    distinct(geneName) %>%
    select(geneName) %>% unlist(use.names = FALSE)
  ##Signif for treatment
  venn.list_2[["- RV\nAnti-IL5 therapy\nvs none"]] <- pval_2 %>%
   filter(group == "AntiIL5 none - none none" &
             adj.P.Val <= fdr.cutoff) %>%
    distinct(geneName) %>%
    select(geneName) %>% unlist(use.names = FALSE)
  venn.list_2[["+ RV\nAnti-IL5 therapy\nvs none"]] <- pval_2 %>%
    filter(group == "AntiIL5_HRV - none_HRV" &
             adj.P.Val <= fdr.cutoff) %>%
    distinct(geneName) %>%
    select(geneName) %>% unlist(use.names = FALSE)
  #Save
  pdf(paste("publication/fig/contrast.venn_", fdr.cutoff, ".pdf", sep=""),
      height=5, width=12)
  par(mfrow = c(1,2))
  venn(ilab=FALSE, zcolor = "style",ilcs=1.5, sncs=1.5, box=FALSE,
```



Hallmark GSEA

Enrichment score



Mean fold change

```
library(cowplot)
library(ggrepel)
#List genes in each Hallmark term
myGO <- fgsea::gmtPathways("data_clean/Broad_gmt/h.all.v7.1.symbols.gmt")
GO.df <- plyr::ldply(myGO, rbind) %>%
  rename(term = `.id`) %>%
  pivot_longer(-term, values_to="hgnc_symbol")
#Expression data
#attach("data clean/P259 pDC clean.RData")
#### Format data ####
#Select genes of interest and format
## P259.2
h.combo.plot_2 <- as.data.frame(dat.pDC.voom_2$E) %>%
  rownames_to_column("geneName") %>%
  #Get HGNC symbols
  left_join(dat.pDC.voom_2$genes) %>%
  select(hgnc_symbol, everything()) %>%
  #Filter to genes in terms
  inner_join(GO.df) %>%
  select(term, hgnc_symbol, geneName, everything(),
         -c(`Previous symbols`:gene_biotype), -name) %>%
  #long format
  pivot_longer(-c(term:geneName), names_to = "libID",
               values_to = "expression") %>%
  #Add metadata
  mutate(experiment = "P259.2") %>%
  left join(select(dat.pDC.voom 2$targets, donorID, libID,
```

```
IL5, virus.detail))
## P259.1
h.combo.plot_1 <- as.data.frame(dat.pDC.voom_1$E) %>%
  rownames_to_column("geneName") %>%
  #Get HGNC symbols
 left_join(dat.pDC.voom_1$genes) %>%
  select(hgnc symbol, everything()) %>%
  #Filter to genes in terms
  inner_join(GO.df) %>%
  select(term, hgnc_symbol, geneName, everything(),
         -c(`Previous symbols`:gene_biotype), -name) %>%
  pivot_longer(-c(term:geneName), names_to = "libID",
               values_to = "expression") %>%
  #Add metadata
  mutate(experiment = "P259.1") %>%
  left_join(select(dat.pDC.voom_1$targets, donorID,
                   libID, IL5, virus.detail))
#Combine data and calculate fold change
h.combo.plot <- bind_rows(h.combo.plot_1, h.combo.plot_2) %>%
  mutate(group = paste(virus.detail, IL5, sep=".")) %>%
  select(-IL5, -virus.detail, -libID) %>%
  #Averages
  group_by(term, hgnc_symbol, experiment, group) %>%
  summarise(meanE = mean(expression, na.rm=TRUE)) %>%
  #Fold change
  pivot_wider(names_from = group, values_from = meanE) %>%
  rowwise() %>%
  #Simplify group names
  mutate(
    #Virus in untreated
   virus.untreat_old = oldHRV.none-none.none,
   virus.untreat_new = newHRV.none-none.none,
    #Virus in treated
   virus.treat_old1 = oldHRV.EOS.supp-none.EOS.supp,
   virus.treat_old2 = oldHRV.AntiIL5-none.AntiIL5,
   virus.treat_new = newHRV.AntiIL5-none.AntiIL5,
    #Treatment in media
   treat.media_1 = none.EOS.supp-none.none,
   treat.media_2 = none.AntiIL5-none.none,
   #Treatment in virus
   treat.virus_old1 = oldHRV.EOS.supp-oldHRV.none,
   treat.virus_old2 = oldHRV.AntiIL5-oldHRV.none,
   treat.virus_new = newHRV.AntiIL5-newHRV.none) %>%
  ungroup() %>%
  #long format
  select(term:experiment, virus.untreat_old:treat.virus_new) %>%
  pivot_longer(virus.untreat_old:treat.virus_new) %>%
  drop_na(value) %>%
```

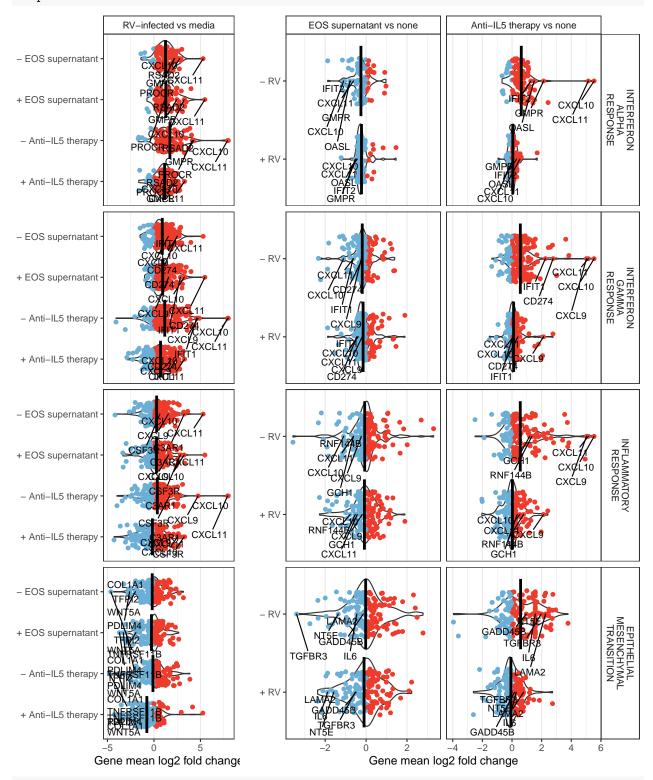
```
#Average old and new HRV values
  separate(name, into=c("group"), sep="_") %>%
  group by (term, hgnc symbol, experiment, group) %>%
  summarise(value = mean(value, na.rm=TRUE)) %>%
  ungroup() %>%
  #Beautify for plotting
  mutate(term = gsub("HALLMARK_","", term),
         term = gsub("_"," ", term)) %>%
  mutate(col.group = ifelse(value <0, "down", "up")) %>%
  mutate(group = factor(group, levels=c("treat.media","treat.virus",
                                         "virus.untreat", "virus.treat")))
#Set jitter
pos <- position_jitter(width = 0.3, seed = 589, height = 0)
#### List genes to label ####
#Set max number of terms
no.genes <- 5
#Set gene sets of interest
term.OI.1s <- c("INTERFERON ALPHA RESPONSE", "INTERFERON GAMMA RESPONSE",
             "INFLAMMATORY RESPONSE",
             "EPITHELIAL MESENCHYMAL TRANSITION")
#Find genes with largest absolute fold change
to.label <- list()</pre>
for(term.OI in term.OI.ls){
  #If this term, find genes that go down with virus
  if(term.OI == "EPITHELIAL MESENCHYMAL TRANSITION"){
    genes.v <- h.combo.plot %>%
      filter(term ==term.OI &
               group %in% c("virus.treat","virus.untreat")) %>%
      group_by(term, hgnc_symbol) %>%
      filter(max(value, na.rm=TRUE)<0) %>%
      summarise(max.fc = max(abs(value), na.rm=TRUE)) %>%
      ungroup() %>%
      slice_max(max.fc,n=no.genes) %>%
      distinct(hgnc_symbol)
  } else{
    #All other terms, find genes that go up with virus
    genes.v <- h.combo.plot %>%
      filter(term ==term.OI &
               group %in% c("virus.treat","virus.untreat")) %>%
      group_by(term, hgnc_symbol) %>%
      filter(min(value, na.rm=TRUE)>0) %>%
      summarise(max.fc = max(value, na.rm=TRUE)) %>%
      ungroup() %>%
      slice_max(max.fc,n=no.genes) %>%
      distinct(hgnc_symbol)
  }
  #Save genes to list object
  to.label[[paste("v",term.OI,sep=".")]] <- genes.v</pre>
```

```
#Find genes that go down with EOS supp
  down.eos <- h.combo.plot %>%
   filter(term == term.OI & group %in% c("treat.media","treat.virus") &
             experiment == "P259.1") %>%
   group_by(term, hgnc_symbol) %>%
   filter(max(value, na.rm=TRUE)<0) %>%
   ungroup() %>%
   distinct(hgnc symbol) %>% unlist(use.names = FALSE)
  #Find genes that go up with AntiIL5
  up.aIL5 <- h.combo.plot %>%
   filter(term == term.OI & group %in% c("treat.media", "treat.virus") &
             experiment == "P259.2") %>%
   group_by(term, hgnc_symbol) %>%
   filter(min(value, na.rm=TRUE)>0) %>%
   ungroup() %>%
   distinct(hgnc_symbol) %>% unlist(use.names = FALSE)
  #Concatenate to genes that go up/down with virus and down with EOS and
  # up with AntiIL5
  ## i.e. follow the directions in the enrichment score plot
  genes.t <- h.combo.plot %>%
   filter(term == term.OI &
             group %in% c("virus.treat","virus.untreat")) %>%
   filter(hgnc_symbol %in% intersect(down.eos,up.aIL5)) %>%
   group_by(term, hgnc_symbol) %>%
   filter(max(abs(value), na.rm=TRUE)>0) %>%
    summarise(max.fc = max(abs(value), na.rm=TRUE)) %>%
   ungroup() %>%
    slice_max(max.fc,n=no.genes) %>%
   distinct(hgnc_symbol)
  #Save to list object
  to.label[[paste("t",term.OI,sep=".")]] <- genes.t</pre>
#Convert genes to label to df
to.label.df <- data.table::rbindlist(to.label, idcol="name") %>%
  separate(name, into=c("vt","term"), sep="[.]") %>%
  mutate(group1 = ifelse(vt == "t", "treat.media", "virus.untreat"),
         group2 = ifelse(vt == "t", "treat.virus", "virus.treat")) %>%
  pivot_longer(group1:group2, values_to="group") %>%
  dplyr::select(-name, -vt) %>%
  mutate(to.label = "y")
#add genes to label info to other plot data
h.combo.plot.lab <- h.combo.plot %>%
  full_join(to.label.df, by = c("term", "hgnc_symbol", "group"))
### FC plot data ####
FC.plot.dat <- h.combo.plot.lab %>%
  #Beautify labels
```

```
mutate(group = paste(experiment, group, sep="_")) %>%
  mutate(group1 = recode_factor(factor(group),
                  "P259.2_virus.treat"="+ Anti-IL5 therapy",
                  "P259.2 virus.untreat"="- Anti-IL5 therapy",
                  "P259.1_virus.treat"="+ EOS supernatant",
                  "P259.1_virus.untreat"="- EOS supernatant",
                  "P259.1 treat.virus"="+ RV",
                  "P259.2 treat.virus"="+ RV",
                  "P259.1 treat.media"="- RV",
                  "P259.2 treat.media"="- RV"),
         group2 = recode_factor(factor(group),
                  "P259.1_virus.untreat"="RV-infected vs media",
                  "P259.2_virus.untreat"="RV-infected vs media",
                  "P259.1_virus.treat"="RV-infected vs media",
                  "P259.2_virus.treat"="RV-infected vs media",
                  "P259.1_treat.virus"="EOS supernatant vs none",
                  "P259.2_treat.virus"="Anti-IL5 therapy vs none",
                  "P259.1_treat.media"="EOS supernatant vs none",
                  "P259.2_treat.media"="Anti-IL5 therapy vs none")) %>%
    #Reorder terms
   mutate(term.ord = recode factor(factor(term),
  "INTERFERON ALPHA RESPONSE"="INTERFERON\nALPHA\nRESPONSE",
  "INTERFERON GAMMA RESPONSE"="INTERFERON\nGAMMA\nRESPONSE",
  "INFLAMMATORY RESPONSE"="INFLAMMATORY\nRESPONSE",
  "EPITHELIAL MESENCHYMAL TRANSITION"="EPITHELIAL\nMESENCHYMAL\nTRANSITION"))
#### FC plot: VIRUS ####
dat.v <- FC.plot.dat %>%
  #Reorder terms
      filter(group2 == "RV-infected vs media" &
             term.ord %in% c("INTERFERON\nALPHA\nRESPONSE",
                           "INTERFERON\nGAMMA\nRESPONSE",
                           "INFLAMMATORY\nRESPONSE",
                           "EPITHELIAL\nMESENCHYMAL\nTRANSITION"))
plot.v <- dat.v %>%
      ggplot(aes(x = group1, y=value)) +
      geom_violin() +
      #Add non-labeled points
      geom_jitter(data=filter(dat.v, is.na(to.label)),
                  aes(color=col.group), position = pos) +
      #Add labeled points
      geom_point(data=filter(dat.v, !is.na(to.label)),
                 aes(color=col.group), ) +
      #Add labels left
      geom_text_repel(data=filter(dat.v, !is.na(to.label)),
                      aes(label=hgnc_symbol), direction="y",
                      hjust=1, nudge_x=-0.4,
                      show.legend = FALSE, size=3) +
      #Add line at O
      #qeom_hline(yintercept = 0, size=0.5) +
```

```
#Add mean lines
      stat_summary(fun="mean", geom="crossbar")+
      facet grid(term.ord~group2, scales="free") +
      coord flip() +
      #Beautify
      theme bw() +
      labs(x="", y="Gene mean log2 fold change") +
      scale_color_manual(values=c("down"="#6baed6","up"="#ef3b2c")) +
      theme(strip.text.y = element blank())+
      theme(legend.position = "none",
            panel.grid.major.y = element_blank(),
            panel.grid.minor.y = element_blank(),
            strip.background =element_rect(fill="white"))
    #plot.v
#### FC plot: TREATMENT ####
dat.t <- FC.plot.dat %>%
  filter(group2 != "RV-infected vs media" &
           term.ord %in% c("INTERFERON\nALPHA\nRESPONSE",
                           "INTERFERON\nGAMMA\nRESPONSE",
                           "INFLAMMATORY\nRESPONSE",
                           "EPITHELIAL\nMESENCHYMAL\nTRANSITION"))
plot.t <- dat.t %>%
  ggplot(aes(x = group1, y=value)) +
  geom violin() +
  #Add non-labeled points
  geom_jitter(data=filter(dat.t, is.na(to.label)),
              aes(color=col.group), position = pos) +
  #Add labeled points
  geom_point(data=filter(dat.t, !is.na(to.label)),
             aes(color=col.group), ) +
  #Add labels left
  geom_text_repel(data=filter(dat.t, !is.na(to.label)),
                  aes(label=hgnc_symbol), direction="y",
                  hjust=1, nudge_x=-0.4,
                  show.legend = FALSE, size=3) +
  #Add line at O
  #geom_hline(yintercept = 0, size=0.5) +
  #Add mean lines
  stat_summary(fun="mean", geom="crossbar")+
  facet_grid(term.ord~group2, scales="free") +
  coord_flip() +
  #Beautify
  theme_bw() +
  labs(x="", y="Gene mean log2 fold change") +
  scale_color_manual(values=c("down"="#6baed6","up"="#ef3b2c")) +
  theme(legend.position = "none",
        panel.grid.major.y = element_blank(),
        panel.grid.minor.y = element_blank(),
        strip.background =element_rect(fill="white"))
#plot.t
```

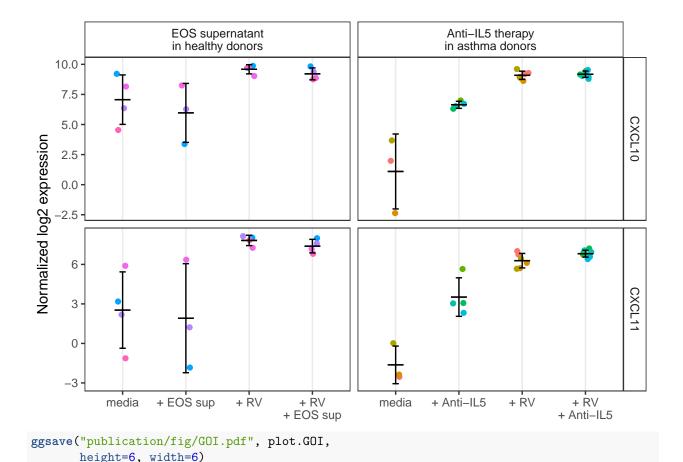
Combine FC plots
fc.plot.all <- plot_grid(plot.v, plot.t, ncol=2, rel_widths = c(0.6,1))
fc.plot.all</pre>



ggsave("publication/fig/H_GSEA_FoldChange.pdf", fc.plot.all,
 width = 20, height = 15)

Genes of interest

```
# List all genes to plot
GOI <- c("CXCL10", "CXCL11")
#Get results for genes of interest
dat.GOI <- bind_rows(h.combo.plot_1, h.combo.plot_2) %>%
 filter(hgnc_symbol %in% GOI) %>%
 dplyr::select(-term) %>% distinct()
plot.GOI <- dat.GOI %>%
  #Beautify labels
  mutate(x.lab=paste(virus.detail,IL5, sep="_"),
         x.lab=gsub("oldH|newH", "", x.lab),
         x.lab=recode factor(factor(x.lab),
                             "none none"="media",
                             "none_EOS.supp"="+ EOS sup",
                             "none AntiIL5"="+ Anti-IL5",
                             "RV_none"="+ RV",
                             "RV EOS.supp"="+ RV\n+ EOS sup",
                             "RV_AntiIL5"="+ RV\n+ Anti-IL5")) %>%
  mutate(ex.lab = recode_factor(factor(experiment),
                      "P259.1"="EOS supernatant\nin healthy donors",
                      "P259.2"="Anti-IL5 therapy\nin asthma donors")) %>%
  arrange(x.lab) %>%
  #Plot
  ggplot(aes(x=x.lab, y=expression, color=donorID)) +
  geom_jitter(width=0.1, height=0) +
  #Add mean and error bars
  stat_summary(fun.data=mean_sdl,
               fun.args = list(mult=1),
               geom="errorbar", color="black", width=0.1) +
  stat_summary(fun=mean, geom="errorbar",
               aes(ymax=..y.., ymin=..y..),
               color="black", width=0.25) +
  #facet experiments and genes
  facet_grid(hgnc_symbol~ex.lab, scales="free") +
  #Beautify
  theme_bw() +
  labs(x="", y="Normalized log2 expression") +
  theme(legend.position = "none",
        panel.grid.major.y = element_blank(),
        panel.grid.minor.y = element_blank(),
        strip.background =element_rect(fill="white"))
plot.GOI
```



R session

sessionInfo()

```
## R version 4.0.0 (2020-04-24)
## Platform: x86 64-apple-darwin17.0 (64-bit)
## Running under: macOS Catalina 10.15.5
## Matrix products: default
          /Library/Frameworks/R.framework/Versions/4.0/Resources/lib/libRblas.dylib
## LAPACK: /Library/Frameworks/R.framework/Versions/4.0/Resources/lib/libRlapack.dylib
## locale:
##
   [1] en_US.UTF-8/en_US.UTF-8/en_US.UTF-8/C/en_US.UTF-8/en_US.UTF-8
##
## attached base packages:
                 graphics grDevices utils
##
  [1] stats
                                                datasets methods
                                                                    base
##
## other attached packages:
   [1] ggrepel_0.8.2
                                        cowplot_1.0.0
                                                         limma_3.44.3
##
                        venn_1.9
    [5] forcats 0.5.0
                                        dplyr_1.0.0
##
                        stringr_1.4.0
                                                         purrr_0.3.4
   [9] readr_1.3.1
                        tidyr_1.1.0
                                        tibble_3.0.3
                                                         ggplot2_3.3.2
##
## [13] tidyverse 1.3.0
##
```

```
## loaded via a namespace (and not attached):
  [1] fs_1.4.2
                            lubridate_1.7.9
                                                 RColorBrewer_1.1-2
                            tools 4.0.0
                                                 backports 1.1.8
  [4] httr 1.4.2
## [7] utf8_1.1.4
                            R6_2.4.1
                                                 rpart_4.1-15
## [10] Hmisc_4.4-0
                            DBI_1.1.0
                                                 colorspace_1.4-1
## [13] nnet 7.3-14
                            withr_2.2.0
                                                 tidyselect 1.1.0
## [16] gridExtra 2.3
                            compiler 4.0.0
                                                 cli 2.0.2
                                                 xm12_1.3.2
## [19] rvest_0.3.6
                            htmlTable_2.0.1
## [22] labeling 0.3
                            scales_1.1.1
                                                 checkmate_2.0.0
## [25] digest_0.6.25
                            foreign_0.8-80
                                                 rmarkdown_2.3
## [28] base64enc_0.1-3
                            jpeg_0.1-8.1
                                                 pkgconfig_2.0.3
                            dbplyr_1.4.4
                                                 htmlwidgets_1.5.1
## [31] htmltools_0.5.0
                            readxl_1.3.1
## [34] rlang_0.4.7
                                                 rstudioapi_0.11
## [37] farver_2.0.3
                            generics_0.0.2
                                                 jsonlite_1.7.0
## [40] BiocParallel_1.22.0
                            acepack_1.4.1
                                                 magrittr_1.5
## [43] Formula_1.2-3
                            Matrix_1.2-18
                                                 Rcpp_1.0.5
## [46] munsell_0.5.0
                            fansi_0.4.1
                                                 lifecycle_0.2.0
## [49] stringi 1.4.6
                            yaml_2.2.1
                                                 plyr 1.8.6
## [52] grid_4.0.0
                            blob_1.2.1
                                                 parallel_4.0.0
## [55] crayon 1.3.4
                            lattice_0.20-41
                                                 haven_2.3.1
## [58] splines_4.0.0
                            hms_0.5.3
                                                 knitr_1.29
## [61] pillar_1.4.6
                            fgsea_1.14.0
                                                 admisc 0.8
## [64] fastmatch_1.1-0
                            reprex_0.3.0
                                                 glue_1.4.1
## [67] evaluate 0.14
                            latticeExtra_0.6-29 data.table_1.13.0
## [70] modelr 0.1.8
                            vctrs_0.3.2
                                                 png_0.1-7
## [73] cellranger 1.1.0
                            gtable_0.3.0
                                                 assertthat_0.2.1
## [76] xfun_0.16
                            broom_0.7.0
                                                 survival_3.2-3
## [79] cluster_2.1.0
                            ellipsis_0.3.1
```