Vitamin D Microbiome Analysis

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5/8/21

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| <pre>library(ggplot2) library(ggpubr) library(ggfortify) #install.packages("pdfcrop") #install.packages("ghostscript")</pre> | |

R Markdown

Install latest version of rlang and LaTex for PDF output knit

Clear global environment

```
rm(list=ls())
```

Setting up R to acknowledge microbiome dataset

```
#Identify path
getwd()

## [1] "C:/Users/neesy/OneDrive/Desktop"

# Set path
setwd("C:/Users/neesy/OneDrive/Desktop")
```

Read this dataset excel file

```
library(readxl)

# Read and View dataset
One_Codex_Results_2021_04_05_18_27_ <- read_excel("C:/Users/neesy/OneDrive/Desktop/One Codex Results (2 sheet = "All Taxa")
View(One_Codex_Results_2021_04_05_18_27_)

# Identify the dataset as "mdata," meaning "microbiome data"
mdata = One_Codex_Results_2021_04_05_18_27_

#tinytex::install_tinytex()</pre>
```

Organize dataset

```
# Pull Phylum (and other independent categories i.e Class etc.) columns and mouse samples only from "md
#install.packages("GLDEX")

Phylum = cbind(mdata[,6],mdata[,13:24])
Class = cbind(mdata[,7],mdata[,13:24])
Order = cbind(mdata[,8],mdata[,13:24])
Family = cbind(mdata[,9],mdata[,13:24])
Genus = cbind(mdata[,10],mdata[,13:24])
Species = cbind(mdata[,11],mdata[,13:24])
```

Omit NA from tables

```
# NA removed from the tables
Phylum2 <- na.omit(Phylum)</pre>
Class2 <- na.omit(Class)</pre>
Order2 <- na.omit(Order)</pre>
Family2 <-na.omit(Family)</pre>
Genus2 <-na.omit(Genus)</pre>
Species2 <-na.omit(Species)</pre>
paste("Original Phylum file dimension")
## [1] "Original Phylum file dimension"
dim(Phylum)
## [1] 3405
               13
paste ("na removed file dimentsion")
## [1] "na removed file dimentsion"
dim(Phylum2)
## [1] 3315
               13
```

Aggregate tables i.e sort mouse samples by bacteria category

```
# Get list of Phylum (and other categories) only

phy <-list(Phylum2$Phylum)
ord <-list(Order2$Order)
clas <-list(Class2$Class)
fam <-list(Family2$Family)
gen <-list(Genus2$Genus)

# Aggregate by list
dtphylum <-aggregate(Phylum2[,2:13],by = phy, FUN="sum")
dtorder <-aggregate(Order2[,2:13],by = ord, FUN="sum")
dtclass <-aggregate(Class2[,2:13],by = clas, FUN="sum")
dtfamily <-aggregate(Family2[,2:13],by = fam, FUN="sum")
dtgenus <-aggregate(Genus2[,2:13],by = gen, FUN="sum")</pre>
```

Remove 0's from pre-melted data

```
phylum0 <-dtphylum[which(rowSums(dtphylum[,2:dim(dtphylum)[2]])>1),]
order0 <-dtorder[which(rowSums(dtorder[,2:dim(dtorder)[2]])>1),]
class0 <-dtclass[which(rowSums(dtclass[,2:dim(dtclass)[2]])>1),]
family0 <-dtfamily[which(rowSums(dtfamily[,2:dim(dtfamily)[2]])>1),]
genus0 <-dtgenus[which(rowSums(dtgenus[,2:dim(dtgenus)[2]])>1),]
species0 <-Species2[which(rowSums(Species2[,2:dim(Species2)[2]])>1),]
```

Log transform data from aggregated tables for ggplot function

Proportion table using pre-melted data

```
\# X = list \ of \ the \ read, \ Y: \ colSums(sample 1), \ x[sample 1]/Y
# Phylum prop table
col_sum <-colSums(phylum0[,2:dim(phylum0)[2]]) # Calculate sum of each column, starting from col 2
head(col_sum)
## 2bd332ec71534b09 c52273f17b8148ac 5d247f45be1c4258 ab61a1c60b33433a
                                                7859927
                                                                  6990508
##
            9704118
                              6710434
## c76d8968674f44a5 c34442318bf4443e
##
            9905087
                            11146673
phylumprop <-matrix(nrow=dim(phylum0)[1], ncol=dim(phylum0)[2]) # Make an empty table with the same dim
rownames(phylumprop) <-phylum0[,1] # Change row names of new table to names in col 1 of phylum0
for (i in 1:dim(phylum0)[1]){
 for (c in 2:dim(phylum0)[2]){
    phylumprop[i,c] <-(phylum0[i,c])/(col_sum[c-1])} # C-1 tells R to divide by colsums-1st columnn
# Remove col 1 from prop table
phylumprop <-phylumprop[, -1]</pre>
# Change col names
colnames(phylumprop) <-(c("VDS1","VDD1","VDD2","VDD3","VDS2","VDD4","VDS3","VDD5","VDD5","VDD6","VDS4","VDD7",</pre>
# Class prop table
col_sum <-colSums(class0[,2:dim(class0)[2]])</pre>
head(col_sum)
## 2bd332ec71534b09 c52273f17b8148ac 5d247f45be1c4258 ab61a1c60b33433a
##
            9605433
                              6549373
                                                7734551
                                                                  6867419
## c76d8968674f44a5 c34442318bf4443e
            9703594
                            11038873
classprop <-matrix(nrow=dim(class0)[1], ncol=dim(class0)[2])</pre>
rownames(classprop) <-class0[,1]</pre>
for (i in 1:dim(class0)[1]){
```

```
for (c in 2:dim(class0)[2]){
    classprop[i,c] <-(class0[i,c])/(col_sum[c-1])} # C-1 tells R to divide by colsums-1st columnn
}
classprop <-classprop[, -1]</pre>
colnames(classprop) <-(c("VDS1","VDD1","VDD2","VDD3","VDS2","VDD4","VDS3","VDD5","VDD6","VDS4","VDD7","</pre>
# Order prop table
col_sum <-colSums(order0[,2:dim(order0)[2]])</pre>
head(col_sum)
## 2bd332ec71534b09 c52273f17b8148ac 5d247f45be1c4258 ab61a1c60b33433a
                                                7453259
                                                                  6628008
            9468046
                              6394584
## c76d8968674f44a5 c34442318bf4443e
            9210614
                             10838997
##
orderprop <-matrix(nrow=dim(order0)[1], ncol=dim(order0)[2])</pre>
rownames(orderprop) <-order0[,1]</pre>
for (i in 1:dim(order0)[1]){
  for (c in 2:dim(order0)[2]){
    orderprop[i,c] <-(order0[i,c])/(col_sum[c-1])} # C-1 tells R to divide by colsums-1st columnn
orderprop <-orderprop[, −1]
colnames(orderprop) <-(c("VDS1","VDD1","VDD2","VDD3","VDS2","VDD4","VDS3","VDD5","VDD6","VDS4","VDD7","</pre>
# Genus prop table
col_sum <-colSums(genus0[,2:dim(genus0)[2]])</pre>
head(col sum)
## 2bd332ec71534b09 c52273f17b8148ac 5d247f45be1c4258 ab61a1c60b33433a
            8167064
                              4886957
                                                5681276
                                                                  5959357
## c76d8968674f44a5 c34442318bf4443e
                              9559215
genusprop <-matrix(nrow=dim(genus0)[1], ncol=dim(genus0)[2])</pre>
rownames(genusprop) <-genus0[,1]</pre>
for (i in 1:dim(genus0)[1]){
 for (c in 2:dim(genus0)[2]){
    genusprop[i,c] <-(genus0[i,c])/(col_sum[c-1])} # C-1 tells R to divide by colsums-1st columnn
}
genusprop <-genusprop[, -1]</pre>
colnames(genusprop) <-(c("VDS1","VDD1","VDD2","VDD3","VDS2","VDD4","VDS3","VDD5","VDD6","VDS4","VDD7","
# Family prop table
col_sum <-colSums(family0[,2:dim(family0)[2]])</pre>
head(col sum)
```

```
## 2bd332ec71534b09 c52273f17b8148ac 5d247f45be1c4258 ab61a1c60b33433a
##
            8938018
                              6065813
                                                7068254
                                                                   6261363
## c76d8968674f44a5 c34442318bf4443e
##
            8799021
                             10449811
familyprop <-matrix(nrow=dim(family0)[1], ncol=dim(family0)[2])</pre>
rownames(familyprop) <-family0[,1]</pre>
for (i in 1:dim(family0)[1]){
 for (c in 2:dim(family0)[2]){
    familyprop[i,c] <-(family0[i,c])/(col_sum[c-1])}</pre>
}
familyprop \leftarrow familyprop[, -1]
colnames(familyprop) <-(c("VDS1","VDD1","VDD2","VDD3","VDS2","VDD4","VDS3","VDD5","VDD5","VDD6","VDS4","VDD7",</pre>
# Species prop table
col_sum <-colSums(species0[,2:dim(species0)[2]])</pre>
head(col_sum)
## 2bd332ec71534b09 c52273f17b8148ac 5d247f45be1c4258 ab61a1c60b33433a
##
            3118984
                              3008476
                                                 3235931
                                                                   2861068
## c76d8968674f44a5 c34442318bf4443e
##
           4394002
                       4487706
speciesprop <-matrix(nrow=dim(species0)[1], ncol=dim(species0)[2])</pre>
rownames(speciesprop) <-species0[,1]</pre>
for (i in 1:dim(species0)[1]){
 for (c in 2:dim(species0)[2]){
    speciesprop[i,c] <-(species0[i,c])/(col_sum[c-1])}</pre>
speciesprop <-speciesprop[, -1]</pre>
colnames(speciesprop) <-(c("VDS1","VDD1","VDD2","VDD3","VDS2","VDD4","VDS3","VDD5","VDD6","VDS4","VDD7"
```

Melt proportion table

```
library(reshape2)

phylummelt <-melt(phylumprop)
classmelt <-melt(classprop)
ordermelt <-melt(orderprop)
familymelt <-melt(familyprop)
genusmelt <-melt(genusprop)
speciesmelt <-melt(speciesprop)
speciesmelt[,4] <-substr(speciesmelt[,2],1,3)</pre>
```

Subset melted prop table to show values >0.5%

```
#install.packages("dplyr")
subsetphylum <-subset(phylummelt, phylummelt[,3]>0.01)
subsetclass <-subset(classmelt, classmelt[,3]>0.01)
subsetorder <-subset(ordermelt, ordermelt[,3]>0.01)
subsetgenus <-subset(genusmelt, genusmelt[,3]>0.01)
subsetfamily <-subset(familymelt, familymelt[,3]>0.01)
subsetspecies <-subset(speciesmelt, speciesmelt[,3]>0.05) #Most specific classification so increased su
```

Proportion plot

```
library(ggplot2)
pdf(file="/Users/neesy/Documents/Phylumprop3.pdf",width = 24,height = 36)
ggplot(subsetspecies, aes(fill=Var1, y=value,x=Var2))+
   geom_bar(position="fill", stat="identity") + theme(legend.position = "bottom")+scale_x_discrete(limit dev.off()

## pdf
## pdf
## 2
```

T-test using prop tables

```
#install.packages("ggpubr")
# Sample columns 1,5,7 and 11 = VDS. Columns 2,3,4,6,8,9,11 and 12 = VDD.
# Phylum t test (independent groups)
phylumtt <-matrix(nrow=dim(phylumprop)[1], ncol=5)</pre>
colnames(phylumtt) <-(c("P","Mean VDS","Mean VDD","Difference","P adj"))</pre>
rownames(phylumtt) <-phylum0[,1]</pre>
for (i in 1:dim(phylumprop)[1]){
    phylumtt[i,1] <-wilcox.test(phylumprop[i,c(2,6,8,11)], phylumprop[i,c(3,4,5,7,9,10,12)])$p.value ##
    phylumtt[i,2] <-mean(phylumprop[i,c(2,6,8,11)]) #mean of VDS</pre>
    phylumtt[i,3] <-mean(phylumprop[i,c(3,4,5,7,9,10,12)]) # mean of VDD
    phylumtt[i,4] \leftarrow mean(phylumprop[i,c(3,4,5,7,9,10,12)]) - mean(phylumprop[i,c(2,6,8,11)]) # Diff (V.)
}
# Adjust p value using Bonferroni
phylumtt[,5] <-p.adjust(phylumtt[,1], method="BH")</pre>
# Class t test
classtt <-matrix(nrow=dim(classprop)[1], ncol=5)</pre>
```

```
colnames(classtt) <-(c("P","Mean VDS","Mean VDD","Difference","P adj"))</pre>
rownames(classtt) <-class0[,1]</pre>
for (i in 1:dim(classprop)[1]){
                          \texttt{classtt[i,1]} \leftarrow \texttt{wilcox.test(classprop[i,c(2,6,8,11)], classprop[i,c(3,4,5,7,9,10,12)])} \\ \texttt{pv} = \texttt{pv} + \texttt{pv} 
                         classtt[i,2] <-mean(classprop[i,c(2,6,8,11)]) #mean of VDS</pre>
                         {\tt classtt[i,3]} \quad {\tt <-mean(classprop[i,c(3,4,5,7,9,10,12)])} \ \textit{\# mean of VDD}
                         classtt[i,4] \leftarrow mean(classprop[i,c(3,4,5,7,9,10,12)]) - mean(classprop[i,c(2,6,8,11)]) # Diff (VDD-1) | VDD-1 | VDD-1
}
classtt[,5] <-p.adjust(classtt[,1], method="BH")</pre>
# Order t test
ordertt <-matrix(nrow=dim(orderprop)[1], ncol=5)</pre>
colnames(ordertt) <-(c("P","Mean VDS","Mean VDD","Difference","P adj"))</pre>
rownames(ordertt) <-order0[,1]</pre>
for (i in 1:dim(orderprop)[1]){
                         ordertt[i,1] <-wilcox.test(orderprop[i,c(2,6,8,11)], orderprop[i,c(3,4,5,7,9,10,12)]) \\ \$p.value \# pv. + p
                         ordertt[i,2] <-mean(orderprop[i,c(2,6,8,11)]) #mean of VDS
                         \label{eq:condition} ordertt[i,3] <- mean (orderprop[i,c(3,4,5,7,9,10,12)]) \textit{ \# mean of VDD}
                         ordertt[i,4] <- mean(orderprop[i,c(3,4,5,7,9,10,12)]) - mean(orderprop[i,c(2,6,8,11)]) # Diff (VDD-
}
ordertt[,5] <-p.adjust(ordertt[,1], method="BH")</pre>
# Family t test
familytt <-matrix(nrow=dim(familyprop)[1], ncol=5)</pre>
colnames(familytt) <-(c("P","Mean VDS","Mean VDD","Difference","P adj"))</pre>
rownames(familytt) <-family0[,1]</pre>
for (i in 1:dim(familyprop)[1]){
                         familytt[i,1] <-wilcox.test(familyprop[i,c(2,6,8,11)], familyprop[i,c(3,4,5,7,9,10,12)]) \\ \$p.value \#\# (2,6,8,11) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,10,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4,5,7,9,12) \\ \#\# (3,4
                         familytt[i,2] <-mean(familyprop[i,c(2,6,8,11)]) #mean of VDS</pre>
                        familytt[i,3] <-mean(familyprop[i,c(3,4,5,7,9,10,12)]) # mean of VDD
                        familytt[i,4] \leftarrow mean(familyprop[i,c(3,4,5,7,9,10,12)]) - mean(familyprop[i,c(2,6,8,11)]) # Diff (V. Contact of the contact o
}
familytt[,5] <-p.adjust(familytt[,1], method="BH")</pre>
# Genus t test
genustt <-matrix(nrow=dim(genusprop)[1], ncol=5)</pre>
colnames(genustt) <-(c("P","Mean VDS","Mean VDD","Difference","P adj"))</pre>
rownames(genustt) <-genus0[,1]</pre>
for (i in 1:dim(genusprop)[1]){
                         genustt[i,1] <-wilcox.test(genusprop[i,c(2,6,8,11)], genusprop[i,c(3,4,5,7,9,10,12)]) p.value \# pv
                         genustt[i,2] <-mean(genusprop[i,c(2,6,8,11)]) #mean of VDS</pre>
                        genustt[i,3] <-mean(genusprop[i,c(3,4,5,7,9,10,12)]) # mean of VDD
                         genustt[i,4] \leftarrow mean(genusprop[i,c(3,4,5,7,9,10,12)]) - mean(genusprop[i,c(2,6,8,11)]) # Diff (VDD-
}
```

```
genustt[,5] <-p.adjust(genustt[,1], method="BH")

# Species t test

speciestt <-matrix(nrow=dim(speciesprop)[1], ncol=5)
colnames(speciestt) <-(c("P","Mean VDS","Mean VDD","Difference","P adj"))
rownames(speciestt) <-species0[,1]
for (i in 1:dim(speciesprop)[1]){
    speciestt[i,1] <-wilcox.test(speciesprop[i,c(2,6,8,11)], speciesprop[i,c(3,4,5,7,9,10,12)], alterna
    speciestt[i,2] <-mean(speciesprop[i,c(2,6,8,11)]) #mean of VDS
    speciestt[i,3] <-mean(speciesprop[i,c(3,4,5,7,9,10,12)]) # mean of VDD
    speciestt[i,4] <- mean(speciesprop[i,c(3,4,5,7,9,10,12)]) - mean(speciesprop[i,c(2,6,8,11)]) # Diff
}
speciestt[,5] <-p.adjust(speciestt[,1], method="BH")</pre>
```

Species violin plot

```
#install.packages("ggpubr")
library(ggpubr)
\#install.packages("ggplot2")
# Look in species prop for the row names that match speciestt that p equals <0.05
sigspecies <-speciesprop[which(rownames(speciesprop)%in%rownames(speciestt[which(speciestt[,1]<0.05),])
siggenus <-genusprop[which(rownames(genusprop)%in%rownames(genustt[which(genustt[,1]<0.05),])),]
# Melt sig species + add column VDS/VDD variable
sigspeciesmelt <-melt(sigspecies)</pre>
sigspeciesmelt[,4] <-substr(sigspeciesmelt[,2],1,3)</pre>
siggenusmelt <-melt(siggenus)</pre>
siggenusmelt[,4] <-substr(siggenusmelt[,2],1,3)</pre>
# Plot 7 sig species
my_comparisons2 <- list(c("VDS","VDD"))</pre>
ggviolin(data = sigspeciesmelt, x = "V4", y = "value", fill="V4", palette = c("lightblue", "orchid2"),
             add = "boxplot", add.params = list(fill = "blue"))+
  facet_wrap(~Var1,scales="free") + stat_compare_means(comparisons = my_comparisons2,method="wilcox.tes")
 labs(title = "Genus taxa",y="Proportion (%)",x="") + theme_bw()
## Warning in wilcox.test.default(c(0, 0, 0, 7.56094178145712e-06), c(0, 0, :
## cannot compute exact p-value with ties
```

Warning in wilcox.test.default(c(0, 0, 4.80070019475683e-06,

```
## 7.08838292011605e-06: cannot compute exact p-value with ties

## Warning in wilcox.test.default(c(0, 4.55165928463392e-06, 0, 0), c(0, 0, :
## cannot compute exact p-value with ties

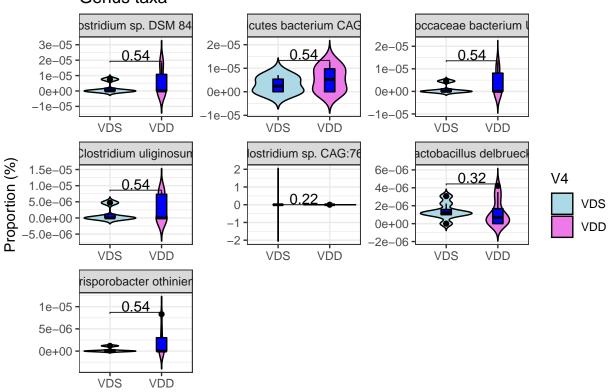
## Warning in wilcox.test.default(c(0, 0, 0, 4.7255886134107e-06), c(0, 0, : cannot
## compute exact p-value with ties

## Warning in wilcox.test.default(c(0, 0, 0, 0), c(1.79492872803373e-05, 0, :
## cannot compute exact p-value with ties

## Warning in wilcox.test.default(c(2.24432058644738e-06, 9.61851679906021e-07, :
## cannot compute exact p-value with ties

## Warning in wilcox.test.default(c(0, 0, 0, 1.18139715335268e-06),
## c(8.30985522237837e-06, : cannot compute exact p-value with ties
```

Genus taxa



```
## Warning in wilcox.test.default(c(0, 0, 0, 0), c(2.04626314493866e-07, 0, :
## cannot compute exact p-value with ties

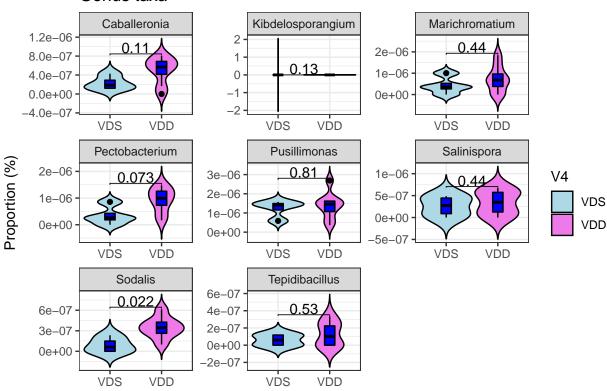
## Warning in wilcox.test.default(c(0, 3.65924121242371e-07,
## 3.51469099832572e-07, : cannot compute exact p-value with ties

## Warning in wilcox.test.default(c(0, 4.87898828323161e-07,
## 1.17156366610857e-07, : cannot compute exact p-value with ties

## Warning in wilcox.test.default(c(0, 1.2197470708079e-07, 2.34312733221715e-07, :
## cannot compute exact p-value with ties

## Warning in wilcox.test.default(c(0, 1.2197470708079e-07, 1.17156366610857e-07, :
## cannot compute exact p-value with ties
```

Genus taxa



Principal component analysis for species

```
# PC analysis & plot

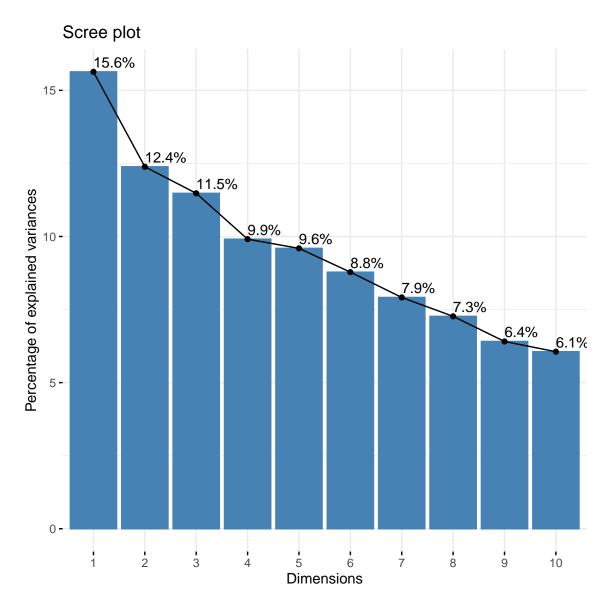
#install.packages("ggfortify")
library(ggfortify)
#install.packages("FactoMineR")
library("FactoMineR")
library("factoextra")
```

Welcome! Want to learn more? See two factoextra-related books at https://goo.gl/ve3WBa

```
#install.packages("kassambara")

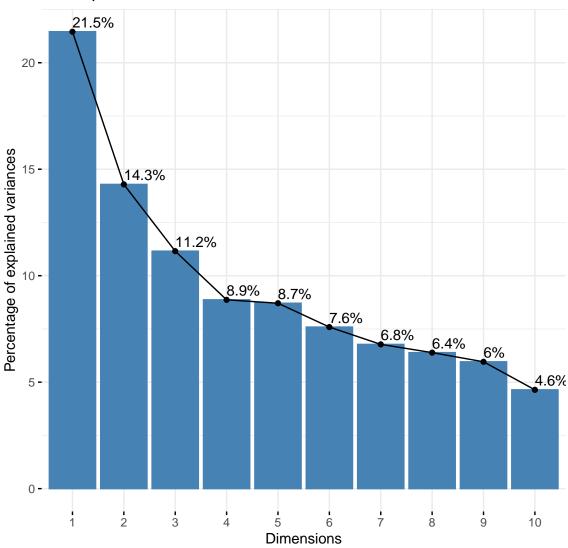
# Compute PCA
speciespca <- prcomp(t(speciesprop), scale = TRUE)
genuspca <-prcomp(t(genusprop), scale = TRUE)

# Visualize eigenvalues in scree plot
fviz_eig(speciespca, addlabels=TRUE)</pre>
```



fviz_eig(genuspca, addlabels=TRUE)





See summary values summary(speciespca)

```
## Importance of components:
##
                              PC1
                                      PC2
                                              PC3
                                                        PC4
                                                                 PC5
                                                                         PC6
## Standard deviation
                          13.1964 11.7458 11.3068 10.50590 10.33780 9.88926
## Proportion of Variance 0.1563
                                   0.1239
                                           0.1148
                                                   0.09908
                                                             0.09593 0.08779
## Cumulative Proportion
                           0.1563
                                   0.2802
                                           0.3949
                                                   0.49401 0.58994 0.67773
                              PC7
                                      PC8
                                              PC9
                                                      PC10
                                                             PC11
## Standard deviation
                          9.38943 8.99756 8.44916 8.21454 7.1429 7.637e-14
## Proportion of Variance 0.07914 0.07267 0.06408 0.06057 0.0458 0.000e+00
## Cumulative Proportion 0.75687 0.82954 0.89363 0.95420 1.0000 1.000e+00
```

summary (genuspca)

Importance of components:

```
PC2
                                               PC3
                                                       PC4
                                                                               PC7
##
                              PC1
                                                               PC5
                                                                       PC6
## Standard deviation
                          13.9043 11.3457 10.0240 8.93778 8.85698 8.26798 7.81248
## Proportion of Variance 0.2146 0.1429 0.1115 0.08866 0.08707 0.07587 0.06774
## Cumulative Proportion
                                   0.3574
                                           0.4690 0.55762 0.64469 0.72056 0.78830
                           0.2146
                              PC8
                                      PC9
                                            PC10
                                                     PC11
                                                               PC12
## Standard deviation
                          7.58610 7.32571 6.4660 6.14145 9.853e-15
## Proportion of Variance 0.06387 0.05956 0.0464 0.04186 0.000e+00
## Cumulative Proportion 0.85217 0.91174 0.9581 1.00000 1.000e+00
# Get eigenvalues
get_eig(speciespca)
            eigenvalue variance.percent cumulative.variance.percent
## Dim.1 1.741442e+02
                           1.563233e+01
                                                            15.63233
## Dim.2 1.379648e+02
                           1.238463e+01
                                                            28.01696
## Dim.3 1.278438e+02
                           1.147611e+01
                                                            39.49306
## Dim.4 1.103740e+02
                                                            49.40096
                           9.907901e+00
## Dim.5 1.068701e+02
                           9.593362e+00
                                                            58.99433
## Dim.6 9.779748e+01
                           8.778948e+00
                                                            67.77327
## Dim.7 8.816135e+01
                           7.913946e+00
                                                            75.68722
## Dim.8 8.095601e+01
                           7.267146e+00
                                                            82.95437
## Dim.9 7.138827e+01
                           6.408283e+00
                                                            89.36265
## Dim.10 6.747867e+01
                           6.057331e+00
                                                            95.41998
## Dim.11 5.102141e+01
                           4.580019e+00
                                                           100.00000
## Dim.12 5.832852e-27
                           5.235953e-28
                                                           100.00000
get_eig(genuspca)
            eigenvalue variance.percent cumulative.variance.percent
##
## Dim.1 1.933292e+02
                           2.145718e+01
                                                            21.45718
## Dim.2 1.287254e+02
                           1.428695e+01
                                                            35.74413
## Dim.3 1.004799e+02
                           1.115204e+01
                                                            46.89618
## Dim.4 7.988400e+01
                           8.866148e+00
                                                            55.76233
## Dim.5 7.844601e+01
                           8.706550e+00
                                                            64.46888
## Dim.6 6.835951e+01
                           7.587071e+00
                                                            72.05595
## Dim.7 6.103484e+01
                           6.774123e+00
                                                            78.83007
## Dim.8 5.754898e+01
                           6.387234e+00
                                                            85.21730
## Dim.9 5.366602e+01
                           5.956273e+00
                                                            91.17358
## Dim.10 4.180868e+01
                           4.640253e+00
                                                            95.81383
## Dim.11 3.771741e+01
                           4.186172e+00
                                                           100.00000
## Dim.12 9.708092e-29
                           1.077480e-29
                                                           100.00000
# Individual points pca plot by VDS/VDD
tt<-speciespca$x[,1:2]
a <- substr(row.names(tt),1,3)
tt<-cbind(tt,a)
tt<-data.frame(tt)
bb<-genuspca$x[,1:2]
c<-substr(row.names(tt),1,3)</pre>
bb<-cbind(bb,c)
```

```
bb < -data.frame(bb)
dev.off()
## null device
##
fviz_pca_ind(genuspca,
             col.ind = a, # color by groups
             palette = c("#00AFBB", "#FC4E07"),
             addEllipses = TRUE, # Concentration ellipses
             ellipse.type = "confidence",
             legend.title = "Groups",
             repel = TRUE
# Individual points pca plot by quality of representation
fviz_pca_ind(speciespca,
             col.ind = "cos2",
             gradient.cols = c("#00AFBB", "#E7B800", "#FC4E07"),
             repel = TRUE  # Avoid text overlapping
```

Subset mdata to look for enrichment overall, rather than within individual taxa

```
# Remove na's from mdata
mdata_na <-na.omit(mdata)

#install.packages("tibble")
library(tibble)

# Add column with row ID
mdataID <-rowid_to_column(mdata_na, "ID")

# Subset to include row ID, taxonomic groups and samples only and turn into matrix
mdata_sub <-subset(mdataID, select=(c(1,7:12,14:25)))
mdata_sub[,1] <-NULL</pre>
```

Overall taxonomic abundance histogram