Clustering UNC23 neo microbiome data

```
### v2.6 add PCA loading
            v2.3 add 2d and 3d plot of pc1 vs pc2 (vs pc3) using weight unifrac with color coded clust
### UNC21.
\#\#\# UNC21. v2.2 remove the subjects that didn't pass inclusion criterion:
### Following up from our morning meet, the two microbiome cases that were recently discovered
### to fail our inclusion criteria are MA035 and MA034. MA035 received gripe water before the neo visi
### MAO34 was in the NICU for several hours after birth and was intubated.
### v1.1 use the precomputed unifrac and weighted unifrac
### v1.2 adds prediction strength from Dan Knight
### v1.3 use the L6 as the genus otu table
### v1.4 adds network analysis by creating Cytoscape file
#setwd('Z:/Kai/bios brain/microbiome/')
#setwd('C:/Dropbox/scripts/microbiome')
#setwd('/Users/kaixia/Dropbox/scripts/microbiome')
if(Sys.info()["sysname"] == 'Windows'){
 dir1 = 'C:/Users/kxia/OneDrive - University of North Carolina at Chapel Hill/github/gmia/scripts'
  dir1 = '/Users/kaixia/OneDrive - University of North Carolina at Chapel Hill/github/gmia/scripts'
setwd(dir1)
library("phyloseq")
library("clusterSim")
## Loading required package: cluster
## Loading required package: MASS
## This is package 'modeest' written by P. PONCET.
## For a complete list of functions, use 'library(help = "modeest")' or 'help.start()'.
library("ggplot2")
## Warning: package 'ggplot2' was built under R version 3.5.2
source('biome.R')
source('prediction_strength.R')
library(scatterplot3d)
library(rgl)
library(fpc)
```

```
##
## Attaching package: 'fpc'
## The following object is masked _by_ '.GlobalEnv':
##
      prediction.strength
library(vegan)
## Warning: package 'vegan' was built under R version 3.5.2
## Loading required package: permute
## Warning: package 'permute' was built under R version 3.5.2
## Loading required package: lattice
## This is vegan 2.5-3
dir_mb = '../processed_data'
dir raw = '../raw data'
dir_cvrt = sprintf('%s/cvrt', dir_raw)
dir_brain = sprintf('%s/braindata', dir_raw)
dir_out = '../results'
dir_fig = '../fig'
dataset = 'neo'
dir_div = sprintf('%s/diversity/%s', dir_raw, dataset)
#dir_beta = sprintf('%s/diversity/%s/core_div/bdiv_even5000', dir_raw, dataset)
#dir1 = 'Z:/Kai/bios brain/microbiome/2018 0502/160527 UNC23 0034 000000000-ANV4F'
dir_otu = sprintf('%s/core_div/taxa_plots',dir_div)
dir_beta = sprintf('%s/core_div/bdiv_even5000',dir_div)
#dir_tax = sprintf('%s/taxa_summary',dir1)
#dataset = 'UNC23'
### try phyloseq, not working at all
#file_biome1 = sprintf("%s/otu_table_no_singletons_no_chimeras.biom",'Z:/Kai/bios_brain/microbiome/2018
file_biome = sprintf("%s/table_mc5000_sorted_L6.txt",dir_otu)
#file_tree = sprintf("%s/rep_set.tre",dir_otu)
# data_biom = system.file("extdata", sprintf("%s/otu_table_no_singletons_no_chimeras.biom",dir_otu), pa
# treefilename = system.file("extdata", sprintf("%s/rep_set.tre",dir_otu), package="phyloseq")
#biomot = import_biom(file_biome, file_tree, parseFunction=parse_taxonomy_greengenes)
#biomot = import_biom(file_biome, file_tree, parseFunction = parse_taxonomy_qiime)
#data_biom0 = import_biom(file_biome, file_tree)
#data_biom1 = import_biom(file_biome)
data_biom0 = read.delim(file_biome,skip=1,strings=FALSE)
Names = colnames(data_biom0)[-1]
data matrix = data biom0[,-1]
rownames(data_matrix) = data_biom0[,1]
taxNames = data_biom0[,1]
```

```
taxNames = as.character((taxNames))
list0 = strsplit(taxNames,';')
taxmat = matrix(unlist(list0),ncol=6,byrow=TRUE)
\#data\_biom
otumat= otu_table(data_matrix,taxa_are_rows=TRUE)
\#taxmat = matrix(sample(letters, 70, replace = TRUE), nrow = nrow(otumat), ncol = 7)
rownames(taxmat) <- rownames(otumat)</pre>
colnames(taxmat) <- c("Domain", "Phylum", "Class", "Order", "Family", "Genus")</pre>
OTU = otu_table(otumat, taxa_are_rows = TRUE)
TAX = tax_table(taxmat)
data_biom = phyloseq(OTU,TAX)
### remove 'MA021.neo' since it is removed requested Alex
idx_rm = c('MAO21.NEO')
Names = sample_names(data_biom)
Names = Names[!Names %in% idx rm]
#Names = Names[!Names %in% id_rm]
data_biom = prune_samples(Names,data_biom)
data_matrix = otu_table(data_biom)
dist_methods = c('unifrac', 'wunifrac', 'jsd', 'rjsd', 'bray')
dist_methods_Names = c('UniFrac','Weighted UniFrac','JSD','rJSD','Bray-Curtis')
#dist_methods = c('jsd', 'rjsd', 'bray')
#dist_methods_Names = c('JSD', 'rJSD', 'Bray-Curtis')
dist_wunifrac = read.table(sprintf('%s/weighted_unifrac_dm.txt',dir_beta),header=TRUE,sep='\t')
dist_wunifrac = dist_wunifrac[,-1]
colnames(dist_wunifrac) = gsub('^X','',colnames(dist_wunifrac))
rownames(dist_wunifrac) = colnames(dist_wunifrac)
dist_wunifrac = dist_wunifrac[rownames(dist_wunifrac) %in% Names, colnames(dist_wunifrac) %in% Names]
## unweighted unifrac
dist_unifrac = read.table(sprintf('%s/unweighted_unifrac_dm.txt',dir_beta),header=TRUE,sep='\t')
dist_unifrac = dist_unifrac[,-1]
colnames(dist_unifrac) = gsub('^X','',colnames(dist_unifrac))
rownames(dist_unifrac) = colnames(dist_unifrac)
dist_unifrac = dist_unifrac[rownames(dist_unifrac) %in% Names, colnames(dist_unifrac) %in% Names]
```

```
# source('prediction_strength.R'); prediction.strength(dist_unifrac)
n_cluster = 8
#nclusters = matrix(NA, n cluster, length(dist methods))
#nclusters = NULL
list_cluster = list()
list_cluster_2c = list()
nclusters = list()
score_methods = c('Average silhouette width','Calinski-Harabasz score','Prediction Strength')
score_Names = c('SH','CH','PS')
for(j in 1:length(score_Names)){
   mx1 = matrix(NA,n_cluster,length(dist_methods))
    colnames(mx1) = dist_methods
   nclusters[[score_Names[j]]] = mx1
}
for(i in 1:length(dist methods)){
    if(dist_methods[i] == 'rjsd'){
        data dist = dist.JSD(data matrix)
   } else if(dist_methods[i] == 'unifrac') {
        data dist = dist unifrac
   } else if(dist_methods[i] == 'wunifrac'){
        data_dist = dist_wunifrac
   } else if(dist_methods[i] == 'bray'){
     data_dist = vegdist(t(data_matrix),method='bray')
   } else{
        data_dist = distance(data_biom,method = dist_methods[i])
   for (k in 1:n_cluster) {
        if (k==1) {
            nclusters[['CH']][k,i] = NA
            nclusters[['SH']][k,i] = NA
            data_cluster_temp=pam.clustering(data_dist, k)
            if(k == 3){
                list_cluster[[i]] = data_cluster_temp
            if(k == 2){
                list_cluster_2c[[i]] = data_cluster_temp
            val_CH=index.G1(t(data_matrix),data_cluster_temp, d = data_dist, centrotypes = "medoids")
            nclusters[['CH']][k,i] = val_CH
            val_SH=mean(silhouette(data_cluster_temp, data_dist)[,3])
            # PS = prediction.strength(data_matrix,k,k,M=3)
            # val_PS =PS$mean.pred[k]
            nclusters[['SH']][k,i] = val_SH
       }
   }
```

```
### add prediction strength
    val_PS = prediction.strength(data_dist, K=2:n_cluster, M=10)
    val PS = as.numeric(val PS)
    nclusters[['PS']][,i] = c(NA, val PS)
}
#### output the 3 cluster results
mx_out = data.frame(id = Names)
for(i in 1:length(list_cluster)){
    mx_out = cbind(mx_out,list_cluster[[i]])
}
colnames(mx_out) = c('ID',dist_methods)
write.table(mx_out,file=sprintf('%s/cluster_results_c3_%s.txt',dir_out,dataset),sep='\t',quote=FALSE,co
#### output the 2 cluster results
mx_out = data.frame(id = Names)
for(i in 1:length(list_cluster_2c)){
    mx_out = cbind(mx_out,list_cluster_2c[[i]])
colnames(mx_out) = c('ID',dist_methods)
write.table(mx_out,file=sprintf('%s/cluster_results_c2_%s.txt',dir_out,dataset),sep='\t',quote=FALSE,co
### load the OTUs
# data1=read.table(sprintf('%s/otu table no singletons no chimeras.txt',dir otu), header=TRUE, skip=1,
# rownames(data1)=data1[,1]
# Ncol = dim(data1)
\# data1 = data1[,-c(1,Ncol-1,Ncol)]
pdf(sprintf('%s/cluster_eval_%s.pdf',dir_fig,dataset),paper='special',width=8,height=8)
#layout(matrix(1:4,2,2,byrow=TRUE))
pchs = c(0:4)
for(j in 1:length(score_Names)){
    #ylims = c(0,0.3)
    if(score_Names[j] == 'CH'){
        #ylims = c(-20, 25)
        ylims = c(-35, 35)
    } else if(score_Names[j] == 'SH'){
            ylims = c(0,0.6)
    } else if(score_Names[j] == 'PS'){
        ylims = c(0,1)
    }
    for(i in 1:length(dist_methods)){
        if(i == 1){
            plot(1:n_cluster,nclusters[[score_Names[j]]][,i], type="b",pch=pchs[i], xlab="k clusters",
        } else{
            points(1:n_cluster,nclusters[[score_Names[j]]][,i],pch=pchs[i],type='b')
    }
    legend('topright',legend=dist_methods_Names,pch=pchs)
}
```

```
#dev.off()
### after the evalution, I choose to use three clusters to get the plot:
library(ade4)
## Warning: package 'ade4' was built under R version 3.5.2
sub size = 2
k=3
data_dist = distance(data_biom,method = 'jsd')
data_cluster = pam.clustering(data_dist,k)
obs.pca=dudi.pca(data.frame(t(data_matrix)), scannf=F, nf=10)
obs.bet=bca(obs.pca, fac=as.factor(data_cluster), scannf=F, nf=k-1)
 s.class(obs.bet$ls, fac=as.factor(data_cluster), grid=F,sub='JSD',csub=sub_size)
 \#text(obs.bet\$ls,labels=colnames(data\_biom),adj=c(-.6,-2),cex=0.3)
## rjsd
 \# k=3
# data_dist = dist.JSD(data_matrix)
# data_cluster = pam.clustering(data_dist,k)
 # obs.pca=dudi.pca(data.frame(t(data matrix)), scannf=F, nf=10)
 # obs.bet=bca(obs.pca, fac=as.factor(data_cluster), scannf=F, nf=k-1)
 # s.class(obs.bet$ls, fac=as.factor(data_cluster), grid=F,sub='JSD',csub=sub_size)
k=3
data_dist = dist_wunifrac
data_cluster = pam.clustering(data_dist,k)
obs.pca=dudi.pca(data.frame(t(data_matrix)), scannf=F, nf=10)
 obs.bet=bca(obs.pca, fac=as.factor(data_cluster), scannf=F, nf=k-1)
 s.class(obs.bet$ls, fac=as.factor(data_cluster), grid=F,sub='wunifrac',csub=sub_size)
k=3
data_dist = dist_unifrac
data_cluster = pam.clustering(data_dist,k)
obs.pca=dudi.pca(data.frame(t(data_matrix)), scannf=F, nf=10)
obs.bet=bca(obs.pca, fac=as.factor(data cluster), scannf=F, nf=k-1)
s.class(obs.bet$ls, fac=as.factor(data_cluster), grid=F,sub='unifrac',csub=sub_size)
# data_dist = distance(data_biom, method = 'bray')
# data_cluster = pam.clustering(data_dist,k)
#
# data_denoized=noise.removal(data_matrix, percent=0.01)
\# obs.pca=dudi.pca(data.frame(t(data_matrix)), scannf=F, nf=10)
# obs.bet=bca(obs.pca, fac=as.factor(data_cluster), scannf=F, nf=k-1)
\# s.class(obs.bet\$ls, fac=as.factor(data_cluster), grid=F,sub='Bray-Curtis',csub=sub_size)
```

```
#dev.off()
#### plot the pc vs clustering membership
#### plot the 2d cluster with weighted unifrac
file_cluster = sprintf('%s/cluster_results_c2_%s.txt',dir_out,dataset)
data1_cluster = read.delim(file_cluster,header=TRUE,strings=FALSE)
clusterNames = colnames(data1_cluster)[c(2,3,4,6)]
### weighted unifrac
file_pc = sprintf('%s/weighted_unifrac_pc_mod.txt',dir_beta)
mx_pc = read.delim(file_pc,header=FALSE,strings=FALSE)
mch1 = match(data1_cluster[,1], mx_pc[,1])
pc1 = mx_pc[mch1, 2]
pc2 = mx_pc[mch1,3]
pc3 = mx_pc[mch1, 4]
layout(matrix(1:4,2,2,byrow=TRUE))
colors = c('red','blue','green')
pchs = c(1,2,3)
for(clusterName in clusterNames){
    cluster_id = data1_cluster[,clusterName]
    #cols = colors[cluster_id]
   plot(pc1,pc2,xlab='PC 1',ylab='PC 2',main=clusterName,col=colors[cluster_id],pch=pchs[cluster_id])
    legend('topleft',legend = c('wunifrac PC 1','wunifrac PC 2'), col = colors[1:2], pch = pchs[1:2])
}
#### plot 3d cluster with weighted unifrac
file_cluster = sprintf('%s/cluster_results_c3_%s.txt',dir_out,dataset)
data1_cluster = read.delim(file_cluster,header=TRUE,strings=FALSE)
layout(matrix(1:4,2,2,byrow=TRUE))
for(clusterName in clusterNames){
    cluster_id = data1_cluster[,clusterName]
    scatterplot3d(x = pc1, y = pc2, z = pc3, color = colors[cluster_id], pch=pchs[cluster_id], xlab='PC
   legend('topleft',legend = c('wunifrac PC 1', 'wunifrac PC 2', 'wunifrac PC 3'), col = colors, pch = ;
    scatterplot3d(x = pc1, y = pc2, z = pc3, color = colors[cluster_id], pch=pchs[cluster_id], xlab='PC
    scatterplot3d(x = pc1, y = pc2, z = pc3, color = colors[cluster_id], pch=pchs[cluster_id], xlab='PC
    scatterplot3d(x = pc1, y = pc2, z = pc3, color = colors[cluster_id], pch=pchs[cluster_id], xlab='PC
}
### unweighted unifrac
file_pc = sprintf('%s/unweighted_unifrac_pc_mod.txt',dir_beta)
mx_pc = read.delim(file_pc,header=FALSE,strings=FALSE)
file_cluster = sprintf('%s/cluster_results_c2_%s.txt',dir_out,dataset)
data1_cluster = read.delim(file_cluster,header=TRUE,strings=FALSE)
```

```
clusterNames = colnames(data1_cluster)[c(2,3,4,6)]
mch1 = match(data1_cluster[,1], mx_pc[,1])
pc1 = mx_pc[mch1, 2]
pc2 = mx_pc[mch1,3]
pc3 = mx_pc[mch1, 4]
layout(matrix(1:4,2,2,byrow=TRUE))
colors = c('red','blue','green')
pchs = c(1,2,3)
for(clusterName in clusterNames){
    cluster_id = data1_cluster[,clusterName]
    #cols = colors[cluster_id]
   plot(pc1,pc2,xlab='PC 1',ylab='PC 2',main=clusterName,col=colors[cluster_id],pch=pchs[cluster_id])
   legend('topleft',legend = c('unifrac PC 1', 'unifrac PC 2'), col = colors[1:2], pch = pchs[1:2])
}
#### plot 3d cluster with unweighted unifrac
file_cluster = sprintf('%s/cluster_results_c3_%s.txt',dir_out,dataset)
data1_cluster = read.delim(file_cluster,header=TRUE,strings=FALSE)
layout(matrix(1:4,2,2,byrow=TRUE))
for(clusterName in clusterNames){
    cluster_id = data1_cluster[,clusterName]
   scatterplot3d(x = pc1, y = pc2, z = pc3, color = colors[cluster_id], pch=pchs[cluster_id], xlab='PC
   legend('topleft',legend = c('unifrac PC 1', 'unifrac PC 2', 'unifrac PC 3'), col = colors, pch = pch
   scatterplot3d(x = pc1, y = pc2, z = pc3, color = colors[cluster_id], pch=pchs[cluster_id], xlab='PC
   scatterplot3d(x = pc1, y = pc2, z = pc3, color = colors[cluster_id], pch=pchs[cluster_id], xlab='PC
   scatterplot3d(x = pc1, y = pc2, z = pc3, color = colors[cluster_id], pch=pchs[cluster_id], xlab='PC
}
dev.off()
## pdf
##
#### get the genus tables
### change the name of the data matrix table to genus name
rowNames = rownames(data_matrix)
#qsub('\\*\\_','',rowNames)
split1 = strsplit(rowNames, '__')
genusNames = rowNames
for(i in 1:length(split1)){
   Names = split1[[i]]
   genusNames[i] = Names[length(Names)]
}
```

```
k=3
for(i in 1:length(dist methods)){
   if(dist methods[i] == 'rjsd'){
       data dist = dist.JSD(data matrix)
   } else if(dist_methods[i] == 'unifrac') {
       data_dist = dist_unifrac
   } else if(dist_methods[i] == 'wunifrac'){
       data_dist = dist_wunifrac
   } else if(dist_methods[i] == 'bray'){
     data_dist = vegdist(t(data_matrix),method='bray')
   }
 else{
       data_dist = distance(data_biom,method = dist_methods[i])
#data_dist = distance(data_biom, method = method)
   data_cluster = pam.clustering(data_dist,k)
   pdf(sprintf('%s/boxplot_abundance_%s_%s_c%s.pdf',dir_fig,dataset,dist_methods[i],k),paper='special'
   layout(matrix(1:16,4,4,byrow=TRUE))
   for(i in 1:dim(data matrix)[1]){
       if(genusNames[i] == ';g'){next}
       if(max(data_matrix[i,]) < 0.01) {next}</pre>
       if(i == dim(data_matrix)[1]){next}
       plot(as.factor(data_cluster),as.numeric(data_matrix[i,]),main=genusNames[i],xlab='Enteroptype')
   }
   dev.off()
}
### weighted unifrac
file_pc = sprintf('%s/weighted_unifrac_pc_mod.txt',dir_beta)
mx_pc = read.delim(file_pc,header=FALSE,strings=FALSE)
pdf(sprintf('%s/PCA_loading_%s.pdf',dir_fig, dataset),width=4*3,height=4*5,paper='special')
layout(matrix(1:2,1,2,byrow=TRUE))
mch1 = match(colnames(data_matrix), mx_pc[,1])
\#pc1 = mx \ pc[mch1,2]
\#pc2 = mx_pc[mch1,3]
pcs = mx_pc[mch1, 2:3]
cor_mx=cor(pcs,t(data_matrix))
for(i in 1:dim(pcs)[2]){
 barplot(cor_mx[i,],main=paste('PC',i,'loading'),horiz=TRUE,names.arg=genusNames,las=2,cex.names = 0.7
}
dev.off()
## pdf
### create network
## enterotype 1: Faecalibacterium
## enterotype 2: Veillonella
```

```
## enterotype 3: Blautia or [Eubacterium]
get_simple_genus_name = function(rowNames){
         split1 = strsplit(rowNames,'__')
        Names1 = rowNames
         for(ii in 1:length(split1)){
                 Names = split1[[ii]]
                 name tmp = Names[length(Names)]
                  if(name_tmp == ";g"){
                          print(name_tmp)
                          name_tmp = paste(Names[length(Names)-1],'_',Names[length(Names)],sep='')
                 Names1[ii] = name tmp
        return(Names1)
}
### change the name of the data_matrix table to genus name
rowNames = rownames(data_matrix)
#gsub('\\*\\_','',rowNames)
split1 = strsplit(rowNames, '__')
genusNames = rowNames
for(i in 1:length(split1)){
        Names = split1[[i]]
         genusNames[i] = Names[length(Names)]
}
genus = c('k__Bacteria;p__Bacteroidetes;c__Bacteroidia;o__Bacteroidales;f__Bacteroidaceae;g__Bacteroide
                           ,'k__Bacteria;p__Firmicutes;c__Clostridia;o__Clostridiales;f__Lachnospiraceae;g__'
                           ,'k__Bacteria;p__Firmicutes;c__Clostridia;o__Clostridiales;f__Veillonellaceae;g__Veillonell
                           ,'k__Bacteria;p__Actinobacteria;c__Actinobacteria;o__Bifidobacteriales;f__Bifidobacteriacea
                           \tt,'k\_Bacteria;p\_Proteobacteria;c\_Gammaproteobacteria;o\_Enterobacteriales;f\_Enterobacteriales;f\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacteria;o\_Enterobacte
                           ,'k__Bacteria;p__Firmicutes;c__Bacilli;o__Lactobacillales;f__Enterococcaceae;g__Enterococcu
genusNames1 = c('Bacteroides','Lachnospiraceae','Veillonella','Bifidobacterium','Enterobacteriaceae','E
### cal correlation matrix
\#mx1 = data_matrix
\#rownames(mx1) = rowNames
cutoff = 0.4
t_matrix = t(data_matrix)
cor1 = cor(t_matrix,method='spearman')
#colnames(cor1) = genusNames
#rownames(cor1) = genusNames
n cluster = 2
genusNames = rownames(data_matrix)
for( i in 1:length(genus)){
         # i = 1;
        fileout = sprintf('cor_network_%s_%s_%s.sif',dataset,n_cluster,i)
        fout = file(fileout, open='w')
        name1 = genus[i]
```

```
print(name1)
idx = which(genusNames == name1)
corNames1 = genusNames[which(cor1[idx,] > cutoff)]
corNames2 = genusNames[which(cor1[idx,] < -cutoff)]</pre>
idx_all = genusNames %in% c(corNames1,corNames2)
mx2 = cor1[idx_all,idx_all]
print(dim(mx2))
# print(name1)
# print('pos')
# print(corNames1)
# print('anti')
# print(corNames2)
# print('\n')
rowNames = rownames(mx2)
#gsub('\\*\\_','',rowNames)
split1 = strsplit(rowNames, '__')
Names1 = rowNames
for(ii in 1:length(split1)){
    Names = split1[[ii]]
    name_tmp = Names[length(Names)]
    if(name_tmp == ";g"){
        print(name_tmp)
        name_tmp = paste(Names[length(Names)-1],'_',Names[length(Names)],sep='')
    Names1[ii] = name_tmp
}
#print(Names1)
\#Names1 = colnames(mx2)
for(j in 1:dim(mx2)[1]){
    for(k in 1:dim(mx2)[1]){
        if(j \le k){next}
        if(abs(mx2[j,k]) < cutoff){next}</pre>
        if(mx2[j,k] > 0){
            inter_type = 'pos'
        } else{
            inter_type = 'neg'
        line1 = paste(Names1[j],'\t',inter_type,'\t',Names1[k],sep='')
        print(line1)
        writeLines(line1,fout,sep='\n')
    }
}
### get the node attribute output
# fileout1 = sprintf('cor_network_%s_%s_%s.noa',dataset,n_cluster,i)
# fout1 = file(fileout1, open='w')
# corNames1 = get_simple_genus_name(corNames1)
```

```
# writeLines("NodeCorrelation", fout1, sep='\n')
   \# writeLines(paste(get_simple_genus_name(name1),' = seed',sep=''),fout1,sep='\n')
   # for(Name1 in corNames1){
       # line1 = paste(Name1, ' = corr', sep='')
       # writeLines(line1, fout1, sep='\n')
   # }
   # corNames2 = get_simple_genus_name(corNames2)
   # #writeLines("NodeCorrelation", fout1, sep='\n')
   # for(Name2 in corNames2){
       # line1 = paste(Name2, ' = anti', sep='')
       # writeLines(line1, fout1, sep='\n')
   # }
   # close(fout1)
   # if(i == 2){
      # break
   close(fout)
}
#
#
# ### run some testing
#
#
# ### v1.1 use the precomputed unifrac and weighted unifrac
# ### v1.2 adds prediction strength from Dan Knight
# ### v1.3 use the L6 as the genus otu table
# ### v1.4 adds network analysis by creating Cytoscape file
# setwd('C:/Dropbox/scripts/microbiome')
# library("phyloseq")
# library("clusterSim")
# library("qqplot2")
# source('biome.R')
# source('prediction_strength.R')
# library(fpc)
```

```
# #dir1 = 'raw_data'
# dir otu = 'raw data/otus'
# dir beta = 'raw data/beta diversity'
# dir_tax = 'raw_data/taxa_summary'
#
# ### try phyloseq, not working at all
# #file_biome = sprintf("%s/otu_table_no_singletons_no_chimeras.biom",dir_otu)
# file_biome = sprintf("%s/otu_table_no_sinqletons_no_chimeras_L6.biom",dir_tax)
# file_tree = sprintf("%s/rep_set.tre",dir_otu)
# # data_biom = system.file("extdata", sprintf("%s/otu_table_no_singletons_no_chimeras.biom",dir_otu),
## treefilename = system.file("extdata", sprintf("%s/rep_set.tre",dir_otu), package="phyloseq")
# #biomot = import_biom(file_biome, file_tree, parseFunction=parse_taxonomy_greengenes)
# #biomot = import_biom(file_biome, file_tree, parseFunction = parse_taxonomy_qiime)
# #data_biom0 = import_biom(file_biome, file_tree)
# data_biom0 = import_biom(file_biome)
# Names = sample_names(data_biom0)
# Names = Names[Names != 'Blank']
# data_biom = prune_samples(Names, data_biom0)
# data_matrix = otu_table(data_biom)
# pdf(sprintf('%s/hist_genera_all_%s.pdf',dir_fig, dataset),width=4*3,height=4*4,paper='special')
# layout(matrix(1:12,4,3,byrow=TRUE))
# for(i in 1:dim(data_matrix)[1]){
# hist(as.numeric(data_matrix[i,]),breaks=100)
# #hist(as.numeric(data_matrix[2,]),breaks=100)
# }
# dev.off()
#
#
# # #### nature paper
# # data1 = read.delim('MetaHIT_SangerSamples.genus.txt',header=TRUE)
# # data matrix = data1[-1,]
# # pdf('fig/hist_genera_nature.pdf',width=4*3,height=4*4,paper='special')
# # layout(matrix(1:12,4,3,byrow=TRUE))
# # for(i in 1:dim(data_matrix)[1]){
       hist(as.numeric(data_matrix[i,]),breaks=100)
# # #hist(as.numeric(data_matrix[2,]),breaks=100)
##}
# # dev.off()
#
```