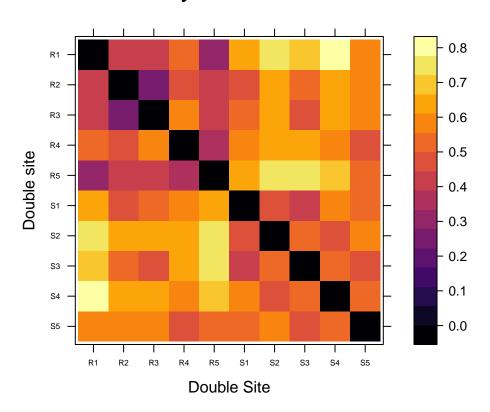
Final_plant_analyses

Caroline Edwards

5/7/2021

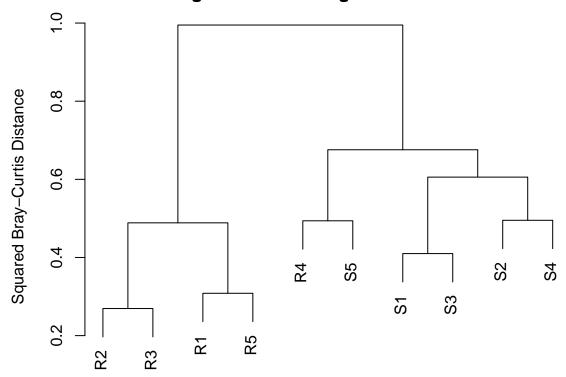
```
rm(list=ls()) #clear your working directory
setwd("~/quant_bio/GitHub/QB2021_Edwards/2.Worksheets/13.DiversityProject/")
package.list<-c('vegan','ade4','viridis','gplots','BiodiversityR','indicspecies','mobsim')</pre>
for (package in package.list){
  if (!require(package, character.only = TRUE, quietly =TRUE)){
    install.packages(package)
   library(package, character.only = TRUE)
## This is vegan 2.5-6
## Warning: package 'ade4' was built under R version 3.6.2
## Warning: package 'gplots' was built under R version 3.6.2
##
## Attaching package: 'gplots'
## The following object is masked from 'package:stats':
##
##
       lowess
## Warning: package 'BiodiversityR' was built under R version 3.6.2
## Registered S3 methods overwritten by 'lme4':
##
     cooks.distance.influence.merMod car
     influence.merMod
                                     car
     dfbeta.influence.merMod
##
                                     car
     dfbetas.influence.merMod
                                     car
## BiodiversityR 2.12-3: Use command BiodiversityRGUI() to launch the Graphical User Interface;
## to see changes use BiodiversityRGUI(changeLog=TRUE, backward.compatibility.messages=TRUE)
## Warning: package 'mobsim' was built under R version 3.6.2
```

Bray-Curtis Distance



```
#Make a cluster analysis for all sites using species relative abundances using bray-curtis distance
veg.ward<-hclust(veg.db, method="ward.D2")
par(mar = c(1,5,2,2)+0.1)
plot(veg.ward, main = "Plants on ridge-to-snowbed gradient: Ward's clustering", ylab = "Squared Bray-Curtical Control of the control
```

Plants on ridge-to-snowbed gradient: Ward's clustering



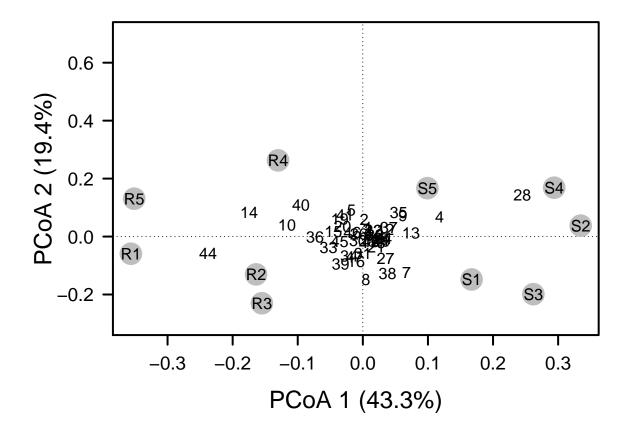
```
#Mantel tests for correlation between plant community and fungal community, environmental dissimilarity
#Read in data and wrangle
veg<-read.csv("veg_data.csv")</pre>
row.names(veg)<-veg[,1]</pre>
veg<-veg[,-1]</pre>
otu_sxs<-read.csv("OTU_table.csv")</pre>
otu_sxs<-t(otu_sxs)
env_var<-read.delim("variables.txt")</pre>
env_var\site<- c(rep("S1", 5), rep("S2", 5), rep("S3", 5), rep("S4", 5), rep("S5", 5), rep("R1", 5), rep("R1", 5)
otu_names<-read.csv("modified_OTU_table.csv")</pre>
OTU_ID<-otu_names$X.OTU.ID
colnames(otu_sxs)<-OTU_ID</pre>
env_var<-read.delim("variables.txt")</pre>
env_var\site<- c(rep("S1", 5), rep("S2", 5), rep("S3", 5), rep("S4", 5), rep("S5", 5), rep("R1", 5), rep
#Take mean of all samples of environmental data at each site, so there is only one value per site
env_P<-tapply(env_var$P, env_var$site, mean)</pre>
env_N<-tapply(env_var$N, env_var$site, mean)</pre>
env_C<-tapply(env_var$C, env_var$site, mean)</pre>
env_V<-c(rep("R", 5), rep("S", 5))
env<-cbind(env_P,env_N,env_C,env_V)</pre>
colnames(env)<-c("P","N","C","Site_type")</pre>
env<-as.data.frame(env)</pre>
```

```
#Rarefaction of otu samples
site_species.r <- rrarefy(otu_sxs, 1000)</pre>
## Warning in rrarefy(otu_sxs, 1000): some row sums < 'sample' and are not rarefied
richness <- rowSums((site_species.r > 0) * 1)
minimum.r <- min(rowSums(site_species.r))</pre>
rarefy <- rarefy(x = site_species.r, sample = minimum.r, se = TRUE)</pre>
#Remove samples containing less than 1000 reads (R1.14, R1.55.2, R2.25, S2.78.2)
df.site_species.r <- as.data.frame(site_species.r)</pre>
rarefied_site_species <- data.frame()</pre>
for (i in 1:nrow(df.site_species.r)){
  if (rowSums(df.site_species.r[i,]) >= 1000){
    rarefied_site_species <- rbind(rarefied_site_species, df.site_species.r[i,])</pre>
  }
}
otu<-as.data.frame(rarefied_site_species)</pre>
otu_site<-c(rep("S1", 5), rep("S2", 5), rep("S3", 5), rep("S4", 5), rep("S5", 5), rep("R1", 4), rep("R2", 5)
#Add up all samples of fungi data at each site, so there is one total value per site
otu_total<-matrix(nrow=10,ncol=807)</pre>
colnames(otu_total)<-OTU_ID</pre>
for (i in 1:(ncol(otu))){
  otu_total[,i]<-tapply(otu[,i], otu_site, sum)</pre>
#Mantel test of the correlation between plant and fungal community dissimilarity and also plant and env
env$P<-as.numeric(env$P)</pre>
env$C<-as.numeric(env$C)</pre>
env$N<-as.numeric(env$N)</pre>
otu.dist<- vegdist(otu_total, method="bray")</pre>
env.dist<- vegdist(scale(env[,-4]), method="euclid")</pre>
veg.dist<- vegdist(veg_sxs, method = "bray")</pre>
mantel(veg.dist, otu.dist)
##
## Mantel statistic based on Pearson's product-moment correlation
##
## Call:
## mantel(xdis = veg.dist, ydis = otu.dist)
## Mantel statistic r: 0.4095
         Significance: 0.014
##
## Upper quantiles of permutations (null model):
    90%
           95% 97.5%
                       99%
## 0.207 0.287 0.338 0.452
## Permutation: free
## Number of permutations: 999
```

```
mantel(veg.dist, env.dist)
##
## Mantel statistic based on Pearson's product-moment correlation
## Call:
## mantel(xdis = veg.dist, ydis = env.dist)
##
## Mantel statistic r: 0.2052
        Significance: 0.091
##
## Upper quantiles of permutations (null model):
   90%
          95% 97.5%
                     99%
## 0.190 0.268 0.320 0.361
## Permutation: free
## Number of permutations: 999
#Indicator species analyses
#Look at indicator species for the two site types in plants and fungi
indval_veg<-multipatt(veg_sxs, cluster=c(rep("R", 5), rep("S", 5)), func = "r.g", control=how(nperm=999
summary(indval veg)
##
##
  Multilevel pattern analysis
##
   _____
##
## Association function: r.g
## Significance level (alpha): 0.05
##
## Total number of species: 47
## Selected number of species: 6
## Number of species associated to 1 group: 6
##
## List of species associated to each combination:
##
## Group R #sps. 4
##
                       stat p.value
## Cladonia.arbuscula 0.946
                            0.010 **
## Trientalis.europaea 0.768
                             0.048 *
## Empetrum.nigrum
                     0.691
                              0.029 *
## Cared.bigelowii
                      0.669
                              0.039 *
##
## Group S #sps.
##
                   stat p.value
## Salix.herbaceae 0.908
                         0.010 **
## Polytrichum.sp. 0.770
                          0.028 *
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
indval_otu<-multipatt(otu_total, cluster=c(rep("R", 5), rep("S", 5)), func = "r.g", control=how(nperm=9)</pre>
summary(indval otu)
```

```
##
##
  Multilevel pattern analysis
##
   -----
##
##
   Association function: r.g
   Significance level (alpha): 0.05
##
##
## Total number of species: 807
## Selected number of species: 15
## Number of species associated to 1 group: 15
## List of species associated to each combination:
##
## Group R #sps. 9
##
        stat p.value
## 793 0.874
              0.011 *
## 444 0.838
              0.011 *
## 1125 0.826
             0.027 *
## 672 0.754
             0.027 *
## 667 0.737
              0.050 *
## 681 0.731
             0.011 *
## 106 0.680
             0.027 *
## 1119 0.654 0.011 *
## 1091 0.421
             0.044 *
##
## Group S #sps. 6
##
       stat p.value
## 410 0.743 0.049 *
## 451 0.737
             0.044 *
## 848 0.697
              0.011 *
## 334 0.626
              0.020 *
## 376 0.593
              0.030 *
## 799 0.515
             0.011 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
site_type<-c(rep("R", 5), rep("S", 5))
adonis(veg_sxs ~ site_type, method = "bray", permutations = 999)
##
## Call:
## adonis(formula = veg_sxs ~ site_type, permutations = 999, method = "bray")
## Permutation: free
## Number of permutations: 999
## Terms added sequentially (first to last)
##
            Df SumsOfSqs MeanSqs F.Model
                                             R2 Pr(>F)
                 0.54964 0.54964 4.9473 0.38211 0.007 **
## site_type 1
## Residuals 8
                 0.88880 0.11110
                                        0.61789
## Total
             9
                1.43844
                                        1.00000
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
```

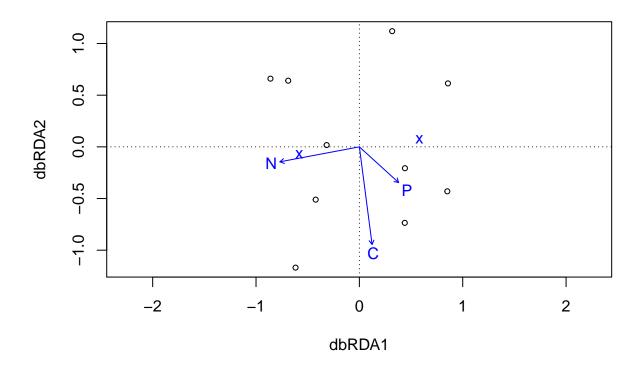
```
#PCoA of plant communties at each site with plant species mapped on
plant.pcoa<- cmdscale(veg.db, eig=TRUE, k=3)</pre>
explainvar1<-round(plant.pcoa$eig[1]/sum(plant.pcoa$eig),3)*100
explainvar2<-round(plant.pcoa$eig[2]/sum(plant.pcoa$eig),3)*100
explainvar3<-round(plant.pcoa$eig[3]/sum(plant.pcoa$eig),3)*100
sum.eig<-sum(explainvar1, explainvar2, explainvar3)</pre>
#png("pcoa_plants.png", units="in", width=7, height=5, res = 600)
par(mar = c(5,5,1,2)+0.1)
plot(plant.pcoa\$point[,1], plant.pcoa\$points[,2], ylim = c(-0.3,0.7),
     xlab=paste("PCoA 1 (", explainvar1, "%)", sep = ""),
     ylab=paste("PCoA 2 (", explainvar2, "%)", sep = ""),
     pch=16, cex=2.0, type="n", cex.lab=1.5, cex.axis=1.2, axes=FALSE)
axis(side=1, labels=T, lwd.ticks = 2, cex.axis=1.2, las=1)
axis(side=2, labels=T, lwd.ticks = 2, cex.axis=1.2, las=1)
abline(h=0, v=0, lty=3)
box(lwd=2)
points(plant.pcoa$points[,1], plant.pcoa$points[,2],
       pch=19, cex=3, bg="gray", col="gray")
text(plant.pcoa$points[,1], plant.pcoa$points[,2],
     labels = row.names(plant.pcoa$points))
plantREL<- veg_sxs</pre>
for(i in 1:nrow(veg sxs)){
 plantREL[i,]=veg_sxs[i,]/sum(veg_sxs[i,])
plant.pcoa<-add.spec.scores(plant.pcoa, plantREL, method="pcoa.scores")</pre>
text(plant.pcoa$cproj[,1], plant.pcoa$cproj[,2],
     labels=c(1:47), col="black")
```



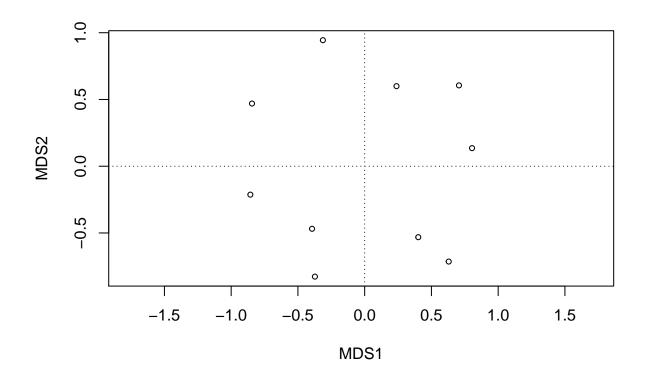
#dev.off()

```
#PCoA with all the soil environmental variables and site type

veg.db<-vegdist(veg_sxs, method = "bray", diag = TRUE)
doubs.dbrda<-dbrda(veg.db ~ ., as.data.frame(env))
ordiplot(doubs.dbrda)</pre>
```



doubs.dbrda.mod0<-dbrda(veg.db~1, as.data.frame(env))
ordiplot(doubs.dbrda.mod0)</pre>



```
doubs.dbrda.mod1<-dbrda(veg.db~., as.data.frame(env))
doubs.dbrda<-ordiR2step(doubs.dbrda.mod0, doubs.dbrda.mod1, perm.max=200)</pre>
```

```
## Step: R2.adj= 0
## Call: veg.db ~ 1
##
##
                   R2.adjusted
## <All variables> 0.363522123
## + Site_type
                   0.304872511
## + N
                   0.192894584
## + C
                   0.015557983
## + P
                   0.001422119
## <none>
                   0.00000000
##
##
               Df
                     AIC
                              F Pr(>F)
## + Site_type 1 1.7676 4.9473 0.014 *
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
##
## Step: R2.adj = 0.3048725
## Call: veg.db ~ Site_type
##
                   R2.adjusted
##
## + C
                     0.3636883
## <All variables>
                     0.3635221
```

```
## <none> 0.3048725
## + N 0.3022031
## + P 0.2976075
```

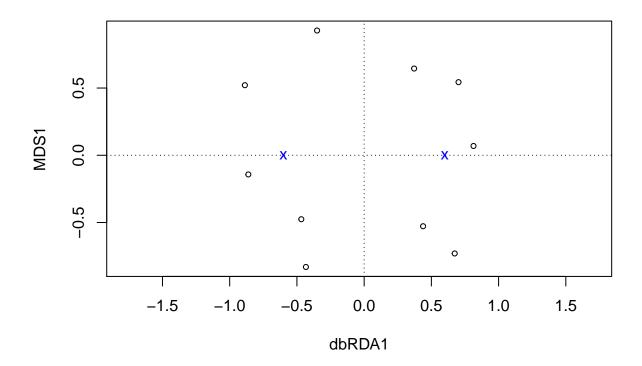
doubs.dbrda\$call

```
## dbrda(formula = veg.db ~ Site_type, data = as.data.frame(env))
```

doubs.dbrda\$anova

```
## R2.adj Df AIC F Pr(>F)
## + Site_type    0.30487    1 1.7676 4.9473    0.014 *
## <All variables> 0.36352
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

ordiplot(doubs.dbrda)

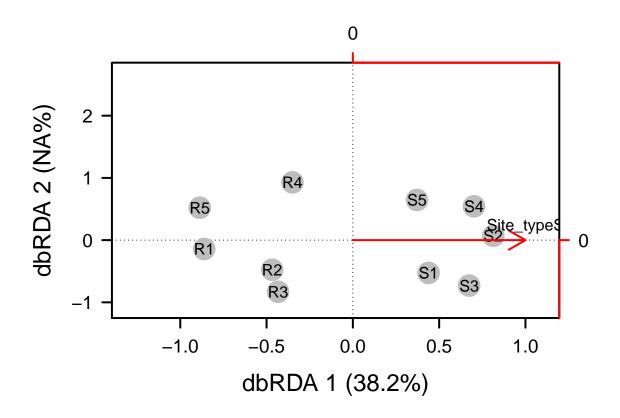


permutest(doubs.dbrda, permutations = 999)

```
##
## Permutation test for dbrda under reduced model
##
```

```
## Permutation: free
## Number of permutations: 999
## Model: dbrda(formula = veg.db ~ Site_type, data = as.data.frame(env))
## Permutation test for all constrained eigenvalues
           Df Inertia
                           F Pr(>F)
           1 0.54964 4.9473 0.011 *
## Model
## Residual 8 0.88880
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
envfit(doubs.dbrda, env, perm=999)
##
## ***VECTORS
##
                 MDS1
                          r2 Pr(>r)
##
       dbRDA1
## P -0.64388 -0.76513 0.3629 0.207
## N 0.99360 0.11292 0.6315 0.035 *
## C -0.16129 -0.98691 0.4454 0.136
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Permutation: free
## Number of permutations: 999
##
## ***FACTORS:
##
## Centroids:
##
              dbRDA1
                        MDS1
## Site_typeR -0.5998 0.0000
## Site_typeS 0.5998 0.0000
## Goodness of fit:
                r2 Pr(>r)
## Site_type 0.4738 0.008 **
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Permutation: free
## Number of permutations: 999
dbrda.explainvar1<-round(doubs.dbrda$CCA$eig[1]/
                           sum(c(doubs.dbrda$CCA$eig, doubs.dbrda$CA$eig)),3)*100
dbrda.explainvar2<-round(doubs.dbrda$CCA$eig[2]/
                          sum(c(doubs.dbrda$CCA$eig, doubs.dbrda$CA$eig)),3)*100
#pnq("dbRDA_plants_4.pnq", units="in", width=5, height=5, res = 600)
par(mar=c(5,5,4,4)+0.1)
plot(scores(doubs.dbrda, display="wa"),xlim=c(-1.3,1.1), ylim=c(-1.1,2.7),
     xlab=paste("dbRDA 1 (", dbrda.explainvar1, "%)", sep=""),
     ylab=paste("dbRDA 2 (", dbrda.explainvar2, "%)", sep=""),
    pch=16, cex=2.0, type="n", cex.lab=1.5, cex.axis=1.2, axes=FALSE)
```

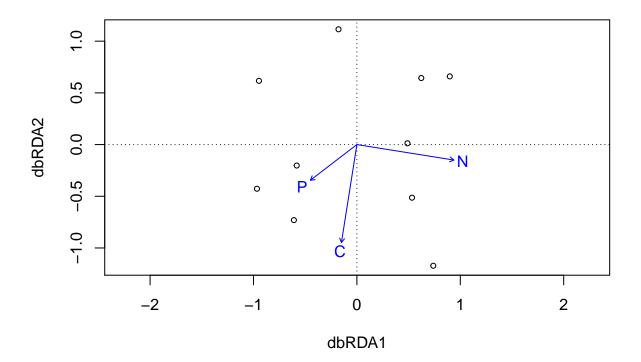
```
axis(side=1, labels=T, lwd.ticks=2, cex.axis=1.2, las=1)
axis(side=2, labels=T, lwd.ticks=2, cex.axis=1.2, las=1)
abline(h=0,v=0,lty=3)
box(lwd=2)
points(scores(doubs.dbrda, display="wa"),
       pch=19, cex=3, bg="gray", col="gray")
text(scores(doubs.dbrda, display="wa"),
     labels=row.names(scores(doubs.dbrda, display="wa")))
vectors<-scores(doubs.dbrda, display = "bp")</pre>
arrows(0,0,vectors[,1], vectors[,2],
       lwd=2, lty=1, length=0.2, col="red")
text(vectors[,1], vectors[,2], pos=3,
     labels=row.names(vectors))
axis(side=3, lwd.ticks = 2, cex.axis=1.2, las=1, col="red", lwd=2.2,
     at=pretty(range(vectors[,1]))*2, labels = pretty(range(vectors[,1])))
axis(side=4, lwd.ticks = 2, cex.axis=1.2, las=1, col="red", lwd=2.2,
     at=pretty(range(vectors[,2]))*2, labels = pretty(range(vectors[,2])))
```



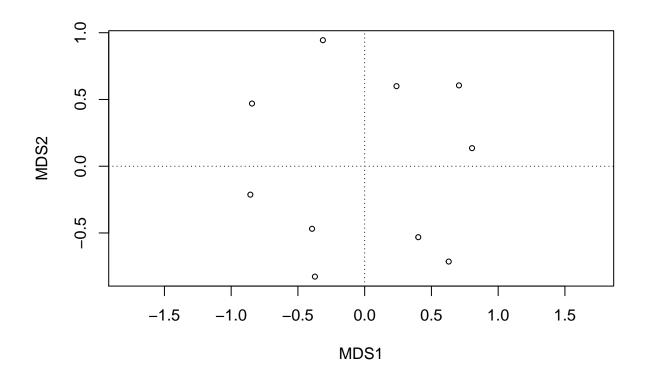
#dev.off()

#PCoA with just the soil environmental variables and not site type

```
veg.db<-vegdist(veg_sxs, method = "bray", diag = TRUE)
env_subset<-env[,-4]
doubs.dbrda<-dbrda(veg.db ~ ., as.data.frame(env_subset))
ordiplot(doubs.dbrda)</pre>
```



```
doubs.dbrda.mod0<-dbrda(veg.db~1, as.data.frame(env_subset))
ordiplot(doubs.dbrda.mod0)</pre>
```



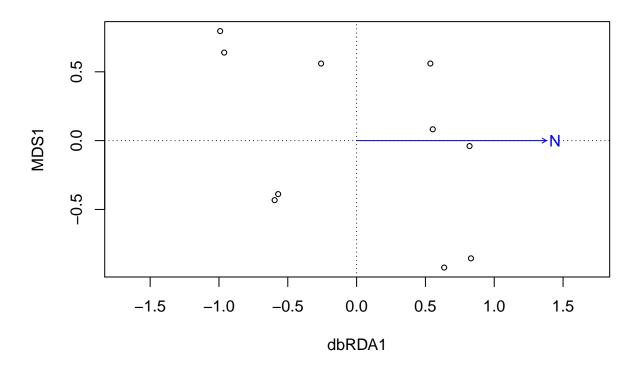
```
doubs.dbrda.mod1<-dbrda(veg.db~., as.data.frame(env_subset))
doubs.dbrda<-ordiR2step(doubs.dbrda.mod0, doubs.dbrda.mod1, perm.max=200)</pre>
```

```
## Step: R2.adj= 0
## Call: veg.db ~ 1
##
##
                    R2.adjusted
## <All variables> 0.199096257
## + N
                    0.192894584
## + C
                    0.015557983
                    0.001422119
## + P
##
  <none>
                    0.00000000
##
##
       \mathsf{Df}
             AIC
                      F Pr(>F)
## + N 1 3.2612 3.151 0.018 *
##
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
##
## Step: R2.adj = 0.1928946
## Call: veg.db ~ N
##
##
                    R2.adjusted
## + C
                      0.2371528
## <All variables>
                      0.1990963
## <none>
                      0.1928946
## + P
                      0.1688228
```

doubs.dbrda\$call

```
## dbrda(formula = veg.db ~ N, data = as.data.frame(env_subset))
```

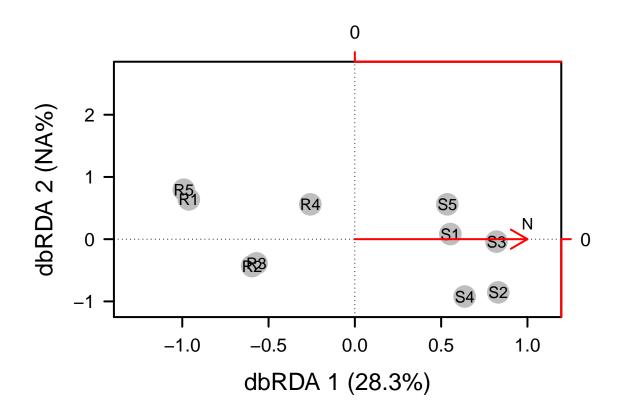
doubs.dbrda\$anova



permutest(doubs.dbrda, permutations = 999)

```
##
## Permutation test for dbrda under reduced model
##
## Permutation: free
## Number of permutations: 999
##
## Model: dbrda(formula = veg.db ~ N, data = as.data.frame(env_subset))
```

```
## Permutation test for all constrained eigenvalues
##
           Df Inertia
                          F Pr(>F)
## Model
           1 0.40647 3.151 0.022 *
## Residual 8 1.03198
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
envfit(doubs.dbrda, env_subset, perm=999)
##
## ***VECTORS
##
##
       dbRDA1
                 MDS1
                          r2 Pr(>r)
## P -0.81953 -0.57303 0.2455 0.375
## N 0.86848 0.49573 0.9361 0.001 ***
## C -0.60531 0.79599 0.0090 0.963
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Permutation: free
## Number of permutations: 999
dbrda.explainvar1<-round(doubs.dbrda$CCA$eig[1]/
                           sum(c(doubs.dbrda$CCA$eig, doubs.dbrda$CA$eig)),3)*100
dbrda.explainvar2<-round(doubs.dbrda$CCA$eig[2]/
                           sum(c(doubs.dbrda$CCA$eig, doubs.dbrda$CA$eig)),3)*100
#pnq("dbRDA_plants_3.pnq", units="in", width=5, height=5, res = 600)
par(mar=c(5,5,4,4)+0.1)
plot(scores(doubs.dbrda, display="wa"),xlim=c(-1.3,1.1), ylim=c(-1.1,2.7),
     xlab=paste("dbRDA 1 (", dbrda.explainvar1, "%)", sep=""),
     ylab=paste("dbRDA 2 (", dbrda.explainvar2, "%)", sep=""),
     pch=16, cex=2.0, type="n", cex.lab=1.5, cex.axis=1.2, axes=FALSE)
axis(side=1, labels=T, lwd.ticks=2, cex.axis=1.2, las=1)
axis(side=2, labels=T, lwd.ticks=2, cex.axis=1.2, las=1)
abline(h=0,v=0,lty=3)
box(1wd=2)
points(scores(doubs.dbrda, display="wa"),
      pch=19, cex=3, bg="gray", col="gray")
text(scores(doubs.dbrda, display="wa"),
     labels=row.names(scores(doubs.dbrda, display="wa")))
vectors<-scores(doubs.dbrda, display = "bp")</pre>
arrows(0,0,vectors[,1], vectors[,2],
       lwd=2, lty=1, length=0.2, col="red")
text(vectors[,1], vectors[,2], pos=3,
     labels=row.names(vectors))
axis(side=3, lwd.ticks = 2, cex.axis=1.2, las=1, col="red", lwd=2.2,
     at=pretty(range(vectors[,1]))*2, labels = pretty(range(vectors[,1])))
axis(side=4, lwd.ticks = 2, cex.axis=1.2, las=1, col="red", lwd=2.2,
     at=pretty(range(vectors[,2]))*2, labels = pretty(range(vectors[,2])))
```



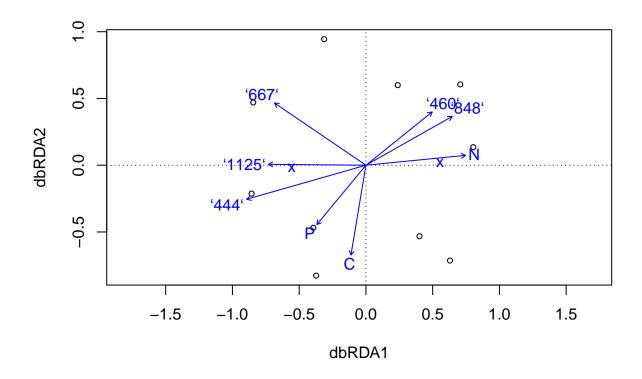
#dev.off()

```
#Add OTU and soil environmental variables together as total plant environment matrix
#Only use OTUs that were highly significant (**) and >0.7 association
otu_total<-as.data.frame(otu_total)

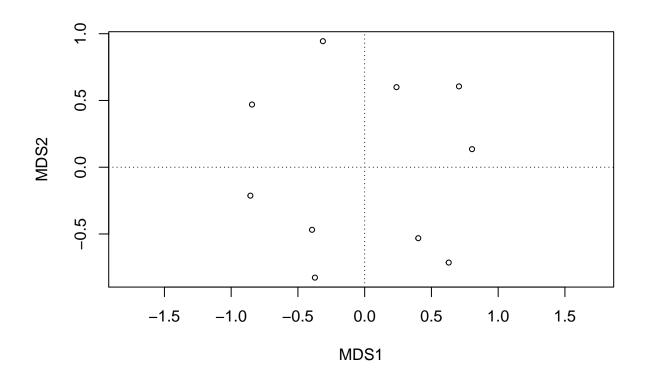
#For the ridge sites
env$'667'<-otu_total$'667'
env$'444'<-otu_total$'444'
env$'1125'<-otu_total$'1125'

#For the snowbed sites
env$'848'<-otu_total$'848'
env$'460'<-otu_total$'460'

#Do PCoA analysis again with new environmental matrix including fungi
veg.db<-vegdist(veg_sxs, method = "bray", diag = TRUE)
doubs.dbrda<-dbrda(veg.db ~ ., as.data.frame(env))
ordiplot(doubs.dbrda)
```



doubs.dbrda.mod0<-dbrda(veg.db~1, as.data.frame(env))
ordiplot(doubs.dbrda.mod0)</pre>



#This function is no longer working - the error says it could be due to "fitting too many terms".

#Before the presentation, it was working fine, so I have included the plot "dbRDA_with_fungi.png"

#which is the output from this part that isn't working anymore

```
# doubs.dbrda.mod1<-dbrda(veg.db~., as.data.frame(env))
# doubs.dbrda<-ordiR2step(doubs.dbrda.mod0, doubs.dbrda.mod1, perm.max=200)
# doubs.dbrda$call
# doubs.dbrda$anova
# ordiplot(doubs.dbrda)
#
# permutest(doubs.dbrda, permutations = 999)
# envfit(doubs.dbrda, env, perm=999)
# dbrda.explainvar1<-round(doubs.dbrda$CCA$eiq[1]/</pre>
                              sum(c(doubs.dbrda\$CCA\$eig,\ doubs.dbrda\$CA\$eig)), 3)*100
#
#
 dbrda.explainvar2<-round(doubs.dbrda$CCA$eiq[2]/
#
                              sum(c(doubs.dbrda\$CCA\$eig, doubs.dbrda\$CA\$eig)),3)*100
#
 #png("dbRDA_with_fungi.png", units="in", width=7, height=5, res = 600)
\# par(mar=c(5,5,4,4)+0.1)
 \# \ plot(scores(doubs.dbrda, \ display="wa"), xlim=c(-1.3,1.1), \ ylim=c(-1.1,2.7), 
       xlab=paste("dbRDA 1 (", dbrda.explainvar1, "%)", sep=""),
       ylab=paste("dbRDA 2 (", dbrda.explainvar2, "%)", sep=""),
```

```
pch=16, cex=2.0, type="n", cex.lab=1.5, cex.axis=1.2, axes=FALSE)
#
# axis(side=1, labels=T, lwd.ticks=2, cex.axis=1.2, las=1)
# axis(side=2, labels=T, lwd.ticks=2, cex.axis=1.2, las=1)
# abline(h=0,v=0,lty=3)
# box(lwd=2)
# points(scores(doubs.dbrda, display="wa"),
       pch=19, cex=3, bg="gray", col="gray")
# text(scores(doubs.dbrda, display="wa"),
     labels=row.names(scores(doubs.dbrda, display="wa")))
# vectors<-scores(doubs.dbrda, display = "bp")</pre>
# arrows(0,0,vectors[,1], vectors[,2],
        lwd=2, lty=1, length=0.2, col="red")
# text(vectors[,1], vectors[,2], pos=3,
     labels=row.names(vectors))
# axis(side=3, lwd.ticks = 2, cex.axis=1.2, las=1, col="red", lwd=2.2,
      at=pretty(range(vectors[,1]))*2, labels = pretty(range(vectors[,1])))
# axis(side=4, lwd.ticks = 2, cex.axis=1.2, las=1, col="red", lwd=2.2,
      at=pretty(range(vectors[,2]))*2, labels = pretty(range(vectors[,2])))
#dev.off()
```