

# Group 1. plant traits

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## Contents

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## step 1. load the data.
library(readxl)
data_plant <- read_excel("data_plant.xlsx", sheet = "TRAITdata")

## step 2. data exploration
# Here we use common R function to explore the files
# Getting some statistics
ncol(data_plant) # number of columns
nrow(data_plant) # ... rows
dim(data_plant)  # dimensions
names(data_plant) # names of columns (colnames works as well)
row.names(data_plant) # if there are row names
str(data_plant)
head(data_plant) # just upper rows
summary(data_plant) # short summary of each variable

# it is possible to mak graphics too
hist(data_plant$LDMCstd)

## We can do the same for community environmental data
## HERE ITS JUST AN OVERVIEW, Feel free to add/remove/update with your favorite functions

## Step 2: set a problematic

## Step 3. Design analyses
library(funspace)
# Community plot
comm = matrix(0, nrow = length(unique(data_plant$Plot)), ncol = length(unique(data_plant$Species)), dimnames = list(unique(data_plant$Plot), unique(data_plant$Species)))

envirVar = c("ET(mm)", "Rad(w/m2)", "T@", "ele(m)", "precip(mm)", "rain", "temp")
envir = matrix(0, nrow = length(unique(data_plant$Plot)), ncol = length(envirVar), dimnames = list(unique(data_plant$Plot), envirVar))
for(i in rownames(comm)){
  comm[i, unique(data_plant[which(data_plant$Plot == i),]$Species)] = 1
  envir[i,] = as.matrix(data_plant[which(data_plant$Plot == i), envirVar][1,])
}
envir = as.data.frame(envir)
## species richness in each comm
SR = apply(comm, 1, sum)
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# traits
traitSelected = c("LDMCstd", "AREAst", "SLAst", "Ldensstd", "height(m)", "Wdensity", "seedmass(g)", "%N", "%C")
trait = data_plant[, c("Species", traitSelected)]
# We can average the values per species
traitMean = matrix(0, ncol = ncol(trait)-1, nrow = length(unique(data_plant$Species)),
                    dimnames = list(unique(data_plant$Species), colnames(trait)[-1]))
for(i in unique(trait$Species)){
  traitMean[i,] = apply(trait[which(trait$Species %in% i),-1], 2, mean, na.rm=T)
}

logscale.traits = scale(log10(traitMean[!colnames(traitMean)%in%c("Wdensity", "seedmass(g)")] + 1))
table(is.na(logscale.traits)) # there are no NA

# Run PCA
pca.trait = princomp(logscale.traits, cor = TRUE)
# Building the functional trait space (using the first two PCs)
trait_space_global = funspace(x = pca.trait, PCs = c(1, 2), n_divisions = 300)
plot(x = trait_space_global, type = "global", quant.plot = TRUE, arrows = TRUE, arrows.length = 0.5)

if (!require("geometry")) install.packages("geometry", repos = "http://cran.us.r-project.org")
library(geometry)
library(FD)
library(funspace)

# Step 1: Define a function to calculate FRic using the convex hull
calculate_fric <- function(traits, comm) {
  traits = traits[names(which(apply(comm, 2, sum) > 0)),]
  comm = comm[, names(which(apply(comm, 2, sum) > 0))]
  # Check if there are enough points to form a convex hull
  if (nrow(traits) > ncol(traits)) {
    fric <- dbFD(traits, comm, calc.FRic = TRUE, calc.CWM = TRUE, calc.FDiv = F)$FRic
  } else {
    fric <- 0 # If not enough points, FRic is 0
  }
  return(fric)
}

# Step 2: Create a null model function to randomize species' traits and recalculate FRic
null_model_fric <- function(traits, comm, num_simulations = 999) {
  null_fric_values <- matrix(0, nc = num_simulations, nr = nrow(comm),
                             dimnames = list(rownames(comm), paste0("Rep.", 1:num_simulations)))

  fd.rand = list()
  for (rand in 1:num_simulations){
    sample.comm = comm
    sample.comm[] = 0
    for(j in 1:nrow(comm)){
      sample.comm[j, names(sample(comm[j,], sum(comm[j,])))] = 1
    }
    null_fric_values[, rand] = calculate_fric(traits, sample.comm)
  }

  return(null_fric_values)
}

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}

# Step 3: Compare observed FRic with the null model
compare_fric_with_null <- function(traits,comm, num_simulations = 999) {
  # Calculate species richness
  richness = apply(comm,1,sum)

  # Calculate observed FRic
  observed_fric <- calculate_fric(traits,comm)

  # Generate null FRic values using the null model
  null_fric_values <- null_model_fric(traits,comm, num_simulations)

  # Calculate ses and p-value: Proportion of null FRic values greater than or equal to observed FRic
  ses <- (observed_fric - apply(null_fric_values,1,mean,na.rm=T)) / apply(null_fric_values,1,sd,na.rm=T)
  p_value <- apply(rbind(observed_fric,t(null_fric_values)),2,function(x){
    length(x[-1][x[1] >= x[-1]])/length(x)
  })

  # Return the results
  return(cbind.data.frame(richness = richness,
                          observed_fric = round(observed_fric,3),
                          mean_exp = round(apply(null_fric_values,1,mean),3),
                          ses = round(ses,3), p_value = round(p_value,3)))
}

# Step 4: Trait and community
traits <- pca.trait$scores[,c(1,2)]

# Compare observed FRic with null model
result <- compare_fric_with_null(traits, comm, num_simulations = 99)

# Print the results
trait_space_comm = funspace(x = pca.trait, PCs = c(1, 2),
                           group.vec = comm[,drop = F],
                           n_divisions = 300)

plot(x = trait_space_comm, type = "groups",
     quant.plot = TRUE, globalContour = T,
     pnt = T,
     pnt.cex = 0.1,
     pnt.col = rgb(0.2, 0.8, 0.1, alpha = 0.2), axis.title.line = 1)

## plots
plot(resFunDivIndex$nbsp,resFunDivIndex$FRic)

## environmental variable
resCWM = functcomp(logscale.traits, comm, CWM.type = "all")

boxplot(resCWM$LDMCstd~envir$rain)
plot(resCWM$LDMCstd~envir$`precip(mm)`~)

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