ESA Workshop

8 August, 2016

Initial Setup

```
# Set working environment
rm(list = ls())
setwd("~/GitHub/ltermetacommunities/ESA_2016/")
# Check for and install required packages
for (package in c('dplyr', 'tidyr', 'vegetarian', 'vegan', 'metacom')) {
  if (!require(package, character.only=T, quietly=T)) {
   install.packages(package)
   library(package, character.only=T)
}
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
## This is vegan 2.4-0
```

Dataset: NWT Plant Communities

Brief background on dataset?

Three analyses for metacommunity time series datasets:

1) Diversity Partitioning [Jost, 2007]

- 2) Variation Partitioning [Borcard et al., 1992, Legendre et al., 2005]
- 3) Elements of Metacommunity Structure [Leibold and Mikkelson, 2002, Presley et al., 2010]

Diversity Paritioning

Variation Partitioning

Elements of Metacommunity Structure

```
# First, we'll test on an individual year
nwt.1989 <- filter(nwt.comm.wide, year == 1989)</pre>
head(nwt.1989)
      plot year 2COMP 2FORB 2GENT 2GRAM 2LICHN 2MOSS 2UNK ALGE ANME2 ANRO2
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nwt.1989 \leftarrow nwt.1989[,-which(colSums(nwt.1989) == 0)]
nwt.1989[,which(colSums(nwt.1989) == 0)]
## data frame with 0 columns and 88 rows
ems.1989 <- Metacommunity(
  decostand(nwt.1989[,-c(1:2)], method = "pa"),
  method = "r1", sims = 100)
IdentifyStructure(ems.1989)
## [1] "Checkerboard (negative coherence)"
Now, we'll take advantage of the time series data
# This function accepts wide-format dataset and prints EMS output
fn.ems.loop <- function(comm.wide){</pre>
  for(year.i in unique(comm.wide$year)){
    comm.year <- filter(comm.wide, year == year.i)[,-c(1:2)] # remove plot & year cols
    comm.year.pa <- decostand(comm.year, method = "pa")</pre>
    comm.year.pa <- comm.year.pa[,which(colSums(comm.year.pa) > 0)] # remove empty cols and rows
    comm.year.pa <- comm.year.pa[which(rowSums(comm.year.pa) > 0),]
    ems.year <- Metacommunity(</pre>
       comm.year.pa,
```

method = "r1", sims = 100)

```
#print(ems.year) # print raw values from EMS analysis
print(IdentifyStructure(ems.year)) # prints the structure of the MC
}
```

Now, call the function:

```
fn.ems.loop(nwt.comm.wide)

## [1] "Checkerboard (negative coherence)"

## [1] "Checkerboard (negative coherence)"
```

References

Daniel Borcard, Pierre Legendre, and Pierre Drapeau. Partialling out the spatial component of ecological variation. *Ecology*, 73(3):1045–1055, 1992. ISSN 00129658. doi: 10.2307/1940179. URL http://www.jstor.org/stable/1940179.

Lou Jost. Partitioning diversity into independent alpha and beta components. *Ecology*, 88(10):2427–2439, 2007. ISSN 0012-9658. doi: 10.1890/06-1736.1. URL http://doi.wiley.com/10.1890/06-1736.1.

Pierre Legendre, Daniel Borcard, and Pedro R. Peres-Neto. Analyzing beta diversity: partitioning the spatial variation of community composition data. *Ecological Monographs*, 75(4):435–450, 2005.

Mathew A. Leibold and Gregory M Mikkelson. Coherence, species turnover, and boundary clumping: elements of meta-community structure. *Oikos*, 97:237–250, 2002. ISSN 1600-0706. doi: 10.1034/j.1600-0706.2002. 970210.x.

Steven J. Presley, Christopher L. Higgins, and Michael R. Willig. A comprehensive framework for the evaluation of metacommunity structure. *Oikos*, 119(6):908–917, 2010. ISSN 00301299. doi: 10.1111/j. 1600-0706.2010.18544.x.