# Package 'cati'

October 2, 2014

Title Community Assembly by Traits: Individuals and beyond

Type Package

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# Description

A package to detect and quantify community assembly processes using trait values of individuals or populations, the T-statistics and other metrics, and dedicated null models.

#### **Details**

Package: cati
Type: Package
Version: 0.92
Date: 2014-04-14
License: GPL (> = 2)

Depends: R (> = 3.0.2), nlme, ade4, ape Imports: e1071, mice, rasterVis, hypervolume

Suggests: lattice, vegan, FD, spacodiR, entropart, fBasics, picante

This package provides functions to calculate T-statistics (Tstats function) and other uni-traits metrics (ComIndex function) to test community assembly traits measured on individuals and beyond (e.g. populations, functional groups). Variance partitioning (partvar function) and density plot (plot-Distri function) are also available. Finaly, this package includes functions to summarize community assembly metrics and functions to plot standardized effect size of index.

# Author(s)

Adrien Taudiere; adrien.taudiere@cefe.cnrs.fr Cyrille Violle

AbToInd	Internal function. like matrix.	Transform abundance	data matrix into inc	dividual

as.listofindex 3

### **Description**

Transform abundance data matrix into individual like matrix to allows the use of ComIndex and ComIndexMulti on populationnal or specific traits values.

# Usage

```
AbToInd(traits, com, type.sp.val = "count")
```

### **Arguments**

traits Individual Matrix of traits with traits in columns. "traits" matrix must have row

names (e.g. species or populationnal names).

com Community data matrix with species in rows and sites in column.

type.sp.val Either "count" or "abundance". Use abundance when all values in the com ma-

trix are not superior to one. Using abundance is EXPERIMENTAL. This func-

tion round abundance to fit count data.

#### **Details**

Internal function

### Value

A list of objects:

\$traits Individual traits matrix
\$sp Vector of species attributes
\$ind.plot Vector of sites attributes

# Author(s)

Adrien Taudiere

as.listofindex Transform index results in a list of index

# Description

Transform various results from functions Tstast, ComIndex or ComIndexMulti in a list of index. Useful to use the functions plot.listofindex (S3 method) and ses.listofindex.

### Usage

```
as.listofindex(x, namesindex = NULL)
```

# Arguments

x A list of objects of class Tstast, ComIndex or ComIndexMulti names index Optionnal, the names of index in the same order as in x.

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#### Value

A list of observed values and corresponding "null" values (i.e. produced by null models) in the form "list(index1, null model index1, index2, null model index2 ...)"

#### Author(s)

Adrien Taudiere

#### See Also

```
ses.listofindex; plot.listofindex
```

```
data(finch.ind)
oldpar <- par(no.readonly = TRUE)</pre>
#The function ComIndex allow to choose your own function
#(like mean, range, variance...) to calculate customize index.
require(e1071)
funct <- c("mean(x, na.rm = TRUE)", "kurtosis(x, na.rm = TRUE)",</pre>
max(x, na.rm = TRUE) - min(x, na.rm = TRUE), CVNND(x)
## Not run:
res.finch.sp_mn2 <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = c(2,2,2,2), ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
res.finch.sp_mn2sp <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = c("2sp","2sp","2sp","2sp"),
ind.plot = ind.plot.finch, nperm = 9, print = FALSE)
res.finch.sp_mn3 <- ComIndex(traits = traits.finch, index = funct, sp = sp.finch,
nullmodels = c("2sp","2sp","2sp","2sp"), ind.plot = ind.plot.finch, nperm = 9,
print = FALSE)
funct <- c("mean(x, na.rm=TRUE)", "kurtosis(x, na.rm=TRUE)",</pre>
max(x, na.rm=TRUE) - min(x, na.rm=TRUE), CVNND(x)
####
#We can represent Standardized Effect Size (ses)
#using the function plot(as.listofindex(list1, list2, list3))
list.ind2 <- list(res.finch.sp_mn2, res.finch.sp_mn2sp)</pre>
index.list2 <- as.listofindex(list.ind2)</pre>
plot(index.list2, type = "bytraits")
plot(index.list2)
```

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```
## End(Not run)
```

Auxiliary functions Auxiliary functions

# **Description**

Auxiliary functions

# Usage

```
funky.col(n)
```

# Arguments

n

number of color for the funky palette

#### **Details**

funky.col is a clone of the palette funky from the adegenet package.

### Value

A color palette

# Author(s)

Thibault Jombart

ComIndex

Computing metrics to test and quantify the non-random assembly of communities

# **Description**

Computing the moments of the trait distribution and other metrics to test and quantify the non-random assembly of communities.

### Usage

```
ComIndex(traits = NULL, index = NULL, nullmodels = NULL,
ind.plot = NULL, sp = NULL, com = NULL, namesindex = NULL,
reg.pool = NULL, nperm = 99, printprogress = TRUE,
type.sp.val = "count")

## S3 method for class 'ComIndex'
plot(x, type = "normal",
col.index = c("red", "purple", "olivedrab3"), add.conf = TRUE,
color.cond = TRUE, val.quant = c(0.025, 0.975), ...)
```

```
## S3 method for class 'ComIndex'
print(x, ...)
## S3 method for class 'ComIndex'
summary(object, ...)
```

### **Arguments**

traits Individual Matrix of traits with traits in column.

index A vector of function to apply to traits vectors in the form mean(x, na.rm = x)

TRUE)" or "range(x)", see examples for more complexe functions.

nullmodels A vector of names corresponding to null models tu use for each index. local

(or 1) corresponds to a randomization of individual values within a given community. **regional.ind** (or 2) corresponds to randomization of individual values within region, ie within all the dataset. A value of **regional.pop** (or 2sp) corresponds to randomization of population values (each individual value are replaced by the mean value of it population) within region. Finally a value of **regional.pop.prab** (or 2sp.prab) mirror null model **regional.pop** but without taking indo account species abundance. For example, if nullmodels = c("local", "regional.ind"), the first index will be calculated on the null model **local** and the

second index on the null model **regional.ind**.

If only one value is given, all the the null model will be determined by this value.

ind.plot Factor defining the name of the plot (site or community) in which the individual

is.

sp Factor defining the species which the individual belong to.

com Community data matrix with species (or populations) in rows and sites in col-

umn. Use only if ind.plot = NULL. "traits" matrix and "com" matrix must have

the same number of rows.

namesindex A vector of names for index.

reg.pool Regional pool data for traits. If not informed, traits is considere as the regional

pool. This matrix need to be larger (more rows) than the matrix "traits". Use

only for null model 2.

nperm Number of permutations. If NULL, only observed values are returned.

printprogress Logical value; print progress during the calculation or not.

type.sp.val Only if ind.plot = NULL. Either "count" or "abundance". Use abundance when

one value or more in the com matrix are inferior to one. Using abundance is

EXPERIMENTAL. This function round abundance to fit count data.

x An object of class ComIndex.

object An object of class ComIndex.

type Type of plot. Possible type = "simple", "simple\_range", "normal", "barplot" and

"bytraits".

col.index Vector of colors for index.

add.conf Logical value; Add confidence intervals or not.

color.cond Logical value; If color.cond = TRUE, color points indicate T-statistics values

significatively different from the null model and grey points are not different

from null model.

val. quant Numeric vectors of length 2, giving the quantile to calculate confidence interval.

By default val.quant = c(0.025,0.975) for a bilateral test with alpha = 5%.

... Any additional arguments are passed to the plot, print or summary function. See

plot.listofindex for more arguments.

#### Details

Compute statistics (e.g. mean, range, CVNND and kurtosis) to test community assembly using null models. For each statistic this function returns observed values and the related null distribution. This function implement four null models which keep unchanged the number of individual per community. Model **local** (1) corresponds to randomization of individual values within community. Model **regional.ind** (2) corresponds to randomization of individual values within region. Model **regional.pop** (2sp) corresponds to randomization of population values within region but whitout taking into account for abundance.

In most cases, models **local** and **regional.ind** correspond to index at the individual level and the model **regional.pop** and **regional.pop.prab** to index at the species level (or any other aggregate variable like genus, family or functionnal group).

S3 method plot for class listofindex: -Normal type plot means, standard deviations, ranges and confidence intervals of T-statistics. -Simple\_range type plot means, standard deviations and range of T-statistics -Simple type plot T-statistics for each site and traits and the mean confidence intervals by traits -Barplot type plot means, standard deviations and confidence intervals of T-statistics in a barplot fashion -Bysites type plot each metrics for each sites -Bytraits type plot each metrics for each traits

#### Value

An object of class "ComIndex" corresponding to a list of lists:

\$obs List of observed values for each trait in each community. Each component of

the list corresponds to a matrix containing the result for each custom function.

\$null List of null values for each trait in each community. Each component of the

list corresponds to an array containing the result of the permutations for each

custom function.

\$list.index List of index values and related null models. Internal use in other function.

Traits in columns.

\$list.index.t List of index values and related null models. Internal use in other function.

Traits in rows.

\$sites\_richness

Number of species per site.

\$namestraits Names of traits.

\$traits traits data

\$ind.plot name of the plot in which the individual is

\$sp groups (e.g. species) which the individual belong to

\$nullmodels List of null models used for each indices.

\$call call of the function Tstats

### Author(s)

Adrien Taudiere

#### See Also

```
ComIndexMulti; plot.listofindex; ses
```

```
data(finch.ind)
oldpar <- par(no.readonly = TRUE)</pre>
#The function ComIndex allow to choose your own function
#(like mean, range, variance...) to calculate customize index.
require(e1071)
funct <- c("mean(x, na.rm = TRUE)", "kurtosis(x, na.rm = TRUE)",</pre>
max(x, na.rm = TRUE) - min(x, na.rm = TRUE), CVNND(x)
## Not run:
res.finch.sp_mn2 <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = c("2","2","2","2"),
ind.plot = ind.plot.finch,nperm = 9, print = FALSE)
res.finch.sp_mn2sp <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = c("2sp","2sp","2sp","2sp"),
ind.plot = ind.plot.finch, nperm = 9, print = FALSE)
####
#We can represent Standardized Effect Size (ses)
#using the function plot(as.listofindex(list1, list2, list3))
list.ind2 <- list(res.finch.sp_mn2, res.finch.sp_mn2sp)</pre>
index.list2 <- as.listofindex(list.ind2)</pre>
plot(index.list2)
plot(index.list2, type = "bytraits")
####
#This allows to calcul index per site
#for example using "tapply(x, sites, mean)".
funct <- c("tapply(x, ind.plot.finch, function(x) mean(x, na.rm = TRUE))",
"tapply(x, ind.plot.finch, function(x) kurtosis(x, na.rm = TRUE))",
"tapply(x, ind.plot.finch, function(x) max(x, na.rm = TRUE) -
min(x, na.rm = TRUE))", "tapply(x, ind.plot.finch, function(x)
CVNND(x))")
##Null model 1 is trivial for this function
#because randomisation is within community only
res.finch.ind_mn1 <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = c(1,1,1,1), ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
```

```
res.finch.ind_mn2 <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = c("2","2","2","2"), ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
####
#We can calcul metrics with or without intraspecific variance.
#Calculation of trait averages per population
#(name_sp_site is a name of a population)
#like in the function ComIndex
#and determine the site for each population (sites_bypop)
name_sp_sites = paste(sp.finch, ind.plot.finch, sep = "_")
traits.by.pop <- apply(traits.finch, 2 , function (x)</pre>
tapply(x, name_sp_sites, mean , na.rm = TRUE))
sites_bypop <- lapply(strsplit(paste(rownames(traits.by.pop), sep = "_"),</pre>
split = "_"), function(x) x[3])
funct.withoutIV <- c("tapply(x, unlist(sites_bypop), function(x)</pre>
mean(x, na.rm = TRUE))", "tapply(x, unlist(sites_bypop), function(x)
kurtosis(x, na.rm = TRUE))", "tapply(x, unlist(sites_bypop), function(x)
max(x, na.rm = TRUE) - min(x, na.rm = TRUE))",
"tapply(x, unlist(sites_bypop), function(x) CVNND(x))" )
funct.withIV <- c("tapply(x, ind.plot.finch, function(x)</pre>
mean(x, na.rm = TRUE))", "tapply(x, ind.plot.finch, function(x)
kurtosis(x, na.rm = TRUE))", "tapply(x, ind.plot.finch, function(x)
max(x, na.rm = TRUE) - min(x, na.rm = TRUE))",
"tapply(x, ind.plot.finch, function(x) CVNND(x))"
res.finch.withIV <- ComIndex(traits = traits.finch, index = funct.withIV,</pre>
sp = sp.finch, nullmodels = c("2","2","2"), ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
res.finch.withoutIV <- ComIndex(traits = traits.finch, index = funct.withoutIV,
sp = sp.finch, nullmodels = c("2sp", "2sp", "2sp", "2sp"),
ind.plot = ind.plot.finch, nperm = 9, print = FALSE)
#We can also represent T-statistics and custom index thanks to
#the plot.listofindex function.
res.finch <- Tstats(traits.finch, ind.plot = ind.plot.finch, sp = sp.finch,
nperm = 9, print = FALSE)
list.ind <- list(res.finch.withIV, res.finch.withoutIV ,res.finch)</pre>
index.list1 <- as.listofindex(list.ind, namesindex = c("mean", "kurtosis",</pre>
"range", "CVNND", "mean.pop", "kurtosis.pop", "range.pop", "CVNND.pop",
"T_IP.IC", "T_IC.IR", "T_PC.PR"))
class(index.list1)
par(mfrow = c(2,3))
plot(index.list1,type = "bysites")
```

```
par(mfrow = c(2,2))
plot(index.list1,type = "bytraits")
par(mfrow = c(1,1))
plot(index.list1,type = "simple")
plot(index.list1,type = "simple_range")
plot(index.list1,type = "normal")
plot(index.list1,type = "barplot")
## End(Not run)
######################################
####Using and community data matrix if there is no data
#available at the individual level.
## Not run:
#create traits data at the species level
traits_by_sp <- apply(traits.finch,2,function(x) tapply(x,sp.finch,</pre>
function(x) mean(x, na.rm = T)))
#create traits data at the populational level
names_sp_ind.plot <- as.factor(paste(sp.finch, ind.plot.finch, sep = "@"))</pre>
traits_by_pop <- apply(traits.finch,2,function(x) tapply(x,names_sp_ind.plot,</pre>
function(x) mean(x, na.rm = T)))
#create community data matrix at the species or populational level
w1 <- table(sp.finch,ind.plot.finch)</pre>
dim(w1)
dim(traits_by_sp)
w2 <- table(names_sp_ind.plot,ind.plot.finch)</pre>
dim(w2)
dim(traits_by_pop)
#Choose indices
require(e1071)
funct <- c("mean(x, na.rm = TRUE)", "kurtosis(x, na.rm = TRUE)",</pre>
''max(x, na.rm = TRUE) - min(x, na.rm = TRUE)", "CVNND(x)")
##################
#with species value
res <- AbToInd(traits_by_sp, w1)</pre>
ComIndex(traits_by_sp, nullmodels = 2, index = funct,
sp = rownames(traits_by_sp), com = w1, nperm = 9)
#################
#with population value
res <- AbToInd(traits_by_pop, w2)</pre>
sp.sp <- unlist(strsplit(rownames(traits_by_pop), "@"))[seq(1,39*2,2)]</pre>
```

```
ComIndex(traits_by_pop, nullmodels = 2, index = funct,
sp = sp.sp, com = w2)
## End(Not run)
####Simple example using null model 2sp.prab (species level without taking
# into acount for species abundance, prab for presence/absence)
## Not run:
traits_by_sp <- apply(traits.finch, 2, function(x)</pre>
tapply(x, name_sp_sites, mean, na.rm=T))
sites_bysp<-unlist(strsplit(rownames(traits_by_sp),</pre>
split="_"))[seq(3,3*dim(traits_by_sp)[1], by=3) ]
funct.withoutIV.prab <- c("tapply(x, unlist(sites_bysp),</pre>
function(x) mean(x, na.rm = TRUE))",
"tapply(x, unlist(sites_bysp), function(x) kurtosis(x, na.rm = TRUE))",
"tapply(x, unlist(sites_bysp), function(x) max(x, na.rm = TRUE)
- \min(x, na.rm = TRUE))",
"tapply(x, unlist(sites_bysp), function(x) CVNND(x))")
res.finch.withoutIV.prab <- ComIndex(traits = traits.finch,</pre>
index = funct.withoutIV.prab, sp = sp.finch,
nullmodels = rep("2sp.prab", times=4), ind.plot = ind.plot.finch,
traits_by_sp <- apply(traits.finch, 2, function(x) tapply(x,</pre>
name_sp_sites, mean, na.rm=T))
sites_bysp<-unlist(strsplit(rownames(traits_by_sp), split="_"))</pre>
[seq(3,3*dim(traits_by_sp)[1], by=3)]
funct.withoutIV.prab <- c("tapply(x, unlist(sites_bysp),</pre>
function(x) mean(x, na.rm = TRUE))",
"tapply(x, unlist(sites_bysp),
function(x) kurtosis(x, na.rm = TRUE))",
"tapply(x, unlist(sites_bysp),
function(x) max(x, na.rm = TRUE) - min(x, na.rm = TRUE))",
"tapply(x, unlist(sites_bysp),
function(x) CVNND(x))")
res.finch.withoutIV.prab <- ComIndex(traits = traits.finch,</pre>
index = funct.withoutIV.prab, sp = sp.finch,
nullmodels = rep("2sp.prab", times=4), ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
list.ind2 <- list(res.finch.withoutIV, res.finch.withoutIV.prab)</pre>
index.list2 <- as.listofindex(list.ind2, namesindex =</pre>
c("mean.pop", "kurtosis.pop", "range.pop", "CVNND.pop",
"mean.prab", "kurtosis.prab", "range.prab", "CVNND.prab"))
plot(index.list2)
## End(Not run)
```

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ComIndexMulti

Computing multitraits metrics to test and quantify the non-random assembly of communities

### **Description**

Computing multitraits metrics to test and quantify the non-random assembly of communities

#### Usage

```
ComIndexMulti(traits = NULL, index = NULL, by.factor = NULL,
nullmodels = NULL, ind.plot = NULL, sp = NULL, com = NULL,
namesindex = NULL, reg.pool = NULL, nperm = 99,
printprogress = TRUE, type.sp.val = "count")

## S3 method for class 'ComIndexMulti'
plot(x, type = "normal",
col.index = c("red", "purple", "olivedrab3"), add.conf = TRUE,
color.cond = TRUE, val.quant = c(0.025, 0.975), ...)

## S3 method for class 'ComIndexMulti'
print(x, ...)

## S3 method for class 'ComIndexMulti'
summary(object, ...)
```

### **Arguments**

traits Individual Matrix of traits with traits in column.

index A vector of functions to apply to traits vectors in the form mean(x, na.rm = x)

TRUE)" or "range(x)".

by factor A factor to split the Matrix of traits and compute index for each subset eg for

each site.

nullmodels A vector of names corresponding to null models tu use for each index. local

(or 1) corresponds to a randomization of individual values within a given community. **regional.ind** (or 2) corresponds to randomization of individual values within region, ie within all the dataset. A value of **regional.pop** (or 2sp) corresponds to randomization of population values (each individual value are replaced by the mean value of it population) within region. Finally a value of **regional.pop.prab** (or 2sp.prab) mirror null model **regional.pop** but without taking indo account species abundance. For example, if nullmodels = c("local", "regional.ind"), the first index will be calculated on the null model **local** and the

second index on the null model regional.ind.

If only one value is given, all the the null model will be determined by this value.

ind.plot Factor defining the name of the plot (site or community) in which the individual

is.

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sp Factor defining the species which the individual belong to.

com Community data matrix with species (or populations) in rows and sites in col-

umn. Use only if ind.plot = NULL. "traits" matrix and "com" matrix must have

the same number of rows.

namesindex A vector of names for metrics.

reg.pool Regional pool data for traits. If not informed, traits is considere as the regional

pool. This matrix need to be larger (more rows) than the matrix "traits". Use

only for null model 2.

nperm Number of permutations. If NULL, only observed values are returned.

printprogress Logical value; print progress during the calculation or not.

type.sp.val Only if ind.plot = NULL. Either "count" or "abundance". Use abundance when

all values in the com matrix are not superior to one.

x An object of class ComIndexMulti.
object An object of class ComIndexMulti.

type Type of plot. Possible type = "simple", "simple\_range", "normal", "barplot" and

"bytraits".

col.index Vector of colors for index.

add.conf Logical value; Add confidence intervals or not.

color.cond Logical value; If color.cond = TRUE, color points indicate T-statistics values

significatively different from the null model and grey points are not different

from null model.

val. quant 
Numeric vectors of length 2, giving the quantile to calculate confidence interval.

By default val.quant = c(0.025,0.975) for a bilateral test with alpha = 5%.

... Any additional arguments are passed to the plot, print or summary function cre-

ating the core of the plot and can be used to adjust the look of resulting graph.

See plot.listofindex for more arguments.

#### **Details**

This function implement four null models which keep unchanged the number of individual per community. Model **local** (1) corresponds to randomization of individual values within community. Model **regional.ind** (2) corresponds to randomization of individual values within region. Model **regional.pop** (2sp) corresponds to randomization of population values within region. Model **regional.pop.prab** (2sp.prab) corresponds to randomization of population values within region but whitout taking into account for abundance.

S3 method plot for class listofindex: -Normal type plot means, standard deviations, ranges and confidence intervals of T-statistics. -Simple\_range type plot means, standard deviations and range of T-statistics -Simple type plot T-statistics for each site and traits and the mean confidence intervals by traits -Barplot type plot means, standard deviations and confidence intervals of T-statistics in a barplot fashion -Bysites type plot each metrics for each sites -Bytraits type plot each metrics for each traits

# Value

A list of lists:

\$obs List of observed values for each trait in each community. Each component of

the list correspond to a matrix containing the result for each custom function.

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\$null List of null values for each trait in each community. Each component of the list

correspond to an array containing the result of the permutations for each custom

function.

\$sites\_richness

Number of species per site.

\$namestraits Names of traits.
\$traits traits data

\$ind.plot name of the plot in which the individual is

\$sp groups (e.g. species) which the individual belong to

\$nullmodels List of null models used for each indices.

\$call call of the function Tstats

\$list.index List of index values and associate null models. Internal use in other function.

Traits in columns.

\$list.index.t List of index values and associate null models. Internal use in other function.

Traits in rows.

# Author(s)

Adrien Taudiere

### See Also

```
ComIndex; plot.listofindex; ses
```

```
data(finch.ind)
#For most multivariate functions we need to replace (or exclude)
#For this example, we use the package mice to complete the data.
## Not run:
names.sp_ind.plot <- as.factor(paste(sp.finch, ind.plot.finch, sep = "_"))</pre>
comm <- t(table(ind.plot.finch,1:length(ind.plot.finch)))</pre>
library(mice)
traits = traits.finch
mice <- mice(traits.finch)</pre>
traits.finch.mice <- complete(mice)</pre>
#A simple example to illustrate the concept of the function
#ComIndexMulti
res.sum.1 <- ComIndexMulti(traits.finch,</pre>
index = c("sum(scale(x), na.rm = TRUE)", "sum(x, na.rm = TRUE)"),
by.factor = names.sp_ind.plot, nullmodels = c(2,2),
ind.plot = ind.plot.finch, nperm = 50, sp = sp.finch)
```

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```
attributes(ses.listofindex(as.listofindex(res.sum.1)))
#A more interesting example using the function hypervolume
#from the package hypervolume.
#We show here several results which differe in there factor
#that delimit the group to calculate different hypervolume
#(argument by_factor).
require(hypervolume)
res.hv.1 <- ComIndexMulti(traits.finch.mice, index =</pre>
paste("as.numeric (try(hypervolume(na.omit(x), warnings = FALSE,",
"bandwidth=0.2, verbose=FALSE)@Volume))"),
by.factor = rep(1,length(names.sp_ind.plot)), nullmodels = c(2,2),
ind.plot = ind.plot.finch, nperm = 9, sp = sp.finch)
res.hv.2 <- ComIndexMulti(traits.finch.mice, index =</pre>
paste("as.numeric(try(hypervolume(na.omit(x), warnings = FALSE,",
"bandwidth=0.2, verbose=FALSE)@Volume))"),
by factor = names.sp_ind.plot, nullmodels = c(2,2),
ind.plot = ind.plot.finch, nperm = 9, sp = sp.finch)
res.hv.3 <- ComIndexMulti(traits.finch.mice, index =</pre>
paste("as.numeric(try(hypervolume(na.omit(x), warnings = FALSE,"
"bandwidth=0.2, verbose=FALSE)@Volume))"),
c("as.numeric (try(hypervolume(na.omit(x),
warnings = FALSE, bandwidth=0.2, verbose=FALSE)@Volume))"),
by.factor = rep(1,length(names.sp_ind.plot)), nullmodels = c(2,2),
ind.plot = ind.plot.finch, nperm = 9, sp = sp.finch)
res.hv.4 <- ComIndexMulti(traits.finch.mice, index =</pre>
paste("as.numeric(try(hypervolume(na.omit(x), warnings = FALSE,",
"bandwidth=0.2, verbose=FALSE)@Volume))"),
c("as.numeric(try(hypervolume(na.omit(x),
warnings = FALSE, bandwidth=0.2, verbose=FALSE)@Volume))"),
by.factor = sp.finch, nullmodels = c(2,2), ind.plot = ind.plot.finch,
nperm = 9, sp = sp.finch)
list.ind.multi <- as.listofindex(list(res.hv.2, res.hv.3, res.hv.4))</pre>
ses.listofindex(list.ind.multi)
plot(list.ind.multi)
plot(list.ind.multi, xlim = c(-200,20))
## End(Not run)
```

decompCTRE

Variance partitioning for multiple traits

# Description

This function decomposes the variation in community trait composition into three sources: (i) the intraspecific trait variability, (ii) the variability due to species turnover and (iii) their covariation is

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also separated. This decomposition is computed for the whole variation in the trait values and, The formula specified, across the contribution of various explanatory variables considered in the model. Barplot.decompCTRE allow to plot the result of the decomposition.

### Usage

```
decompCTRE(traits = NULL, formula = ~1, ind.plot = NULL, sp = NULL,
printprogress = TRUE, ...)
## S3 method for class 'decompCTRE'
barplot(height, resume = TRUE, ...)
```

### **Arguments**

traits

height An object of class decompCTRE obtain by the function decompCTRE. formula

Matrix of traits with traits in column

The formula parameter must be a one-sided formula, i.e. starting with a tilde

(~) character. The response variable is specified by the next two arguments,

specif.avg and const.avg. By default set to ~1.

ind.plot Factor defining the name of the plot (site or community) in which the individual

sp Factor defining the species which the individual belong to. printprogress Logical value; print progress during the calculation or not. Logical. If resume = FALSE, plot one graphic by traits. resume

Optional additional arguments . . .

### Value

An object of class "decompCTRE".

# Author(s)

Adrien Taudiere Jan Leps

#### References

Leps, Jan, Francesco de Bello, Petr Smilauer and Jiri Dolezal. 2011. Community trait response to environment: disentangling species turnover vs intraspecific trait variability effects. Ecography 34 (5): 856-863.

# See Also

```
barplot.decompCTRE; traitflex.anova
```

```
data(finch.ind)
res.decomp <- decompCTRE(traits = traits.finch, sp = sp.finch,</pre>
ind.plot = ind.plot.finch, print = FALSE)
barplot.decompCTRE(res.decomp)
```

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```
par(mfrow = c(2,2))
barplot.decompCTRE(res.decomp, resume = FALSE)
par(mfrow = c(1,1))
```

finch.ind

Finch morphological data

# **Description**

Individual morphological data for Darwin's finches. finch is the all data.frame. ind.plot.finch and sp.finch respectively correspond to the Ilsland and the species attribute of each individual. traits.finch is the matrix of traits with four traits in rows and 2677 individuals in columns.

### Usage

```
data(finch.ind)
```

#### **Format**

A data frame of 2677 individuals in rows and 14 columns.

### **Details**

See http://bioquest.org/birdd/morph.php for more information on database.

### Source

http://bioquest.org/birdd/morph.php

### **Examples**

```
data(finch.ind)
```

Fred

Functional richness, evenness and divergence following Villeger et al. 2008

# Description

Compute the 3 functional diversity indices presented in Villeger et al. 2008 (Ecology 89 2290-2301): Functional richness (FRic), Functional evenness (FEve), Functional divergence (FDiv)

### Usage

```
Fred(traits, ind.plot)
```

# **Arguments**

traits Individual Matrix of traits with traits in columns. NA are not allowed .

ind.plot Factor defining the name of the plot in which the individual is.

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### **Details**

For each trait, values are standardized (mean=0 and standard deviation=1) For FRic computation, number of individuals must be higher than number of traits

### Value

list of 4 vectors with values of indices in each sites

\$nbind number of individuals
\$FRic functional richness index
\$FEve functional evenness index
\$FDiv functional divergence index

### Author(s)

Sebastien Villeger sligthy modified by Adrien Taudiere

#### See Also

```
ComIndexMultiComIndex
```

### **Examples**

```
data(finch.ind)
## Not run:
fred<-Fred(traits.finch.mice, ind.plot.finch)
## End(Not run)</pre>
```

IndexByGroups

Apply metrics to groups.

# **Description**

Transforme a list of metrics to apply them to groups, typically to populations.

# Usage

```
IndexByGroups(metrics, groups)
```

# **Arguments**

metrics A vector of metrics like the argument "index" of function ComIndex

groups Name of the factor to apply the metrics to groups in the form "pop", e.g. popu-

lation

### Value

A vector of transformed metrics

### Author(s)

Adrien Taudiere

MinMaxMST 19

MinMaxMST	Ratio of the shortest distance to the longest distance in a minimum spanning tree

# Description

Ratio of the shortest distance to the longest distance in a minimum spanning tree.

# Usage

```
MinMaxMST(traits, gower.dist = TRUE, scale.tr = TRUE, method.dist = "euclidian")
```

### **Arguments**

traits	Traits matrix (traits in column)
gower.dist	Calculate gower distance using the function gowdis from package FD.
scale.tr	Does traits need to be scale before multi-traits metric calculation? Only use when gower.dist = FALSE. Default is yes.
method.dist	Method to calculate the distance in case of multi-traits metric (function dist). Only use when gower.dist = FALSE. Default is euclidian.

### Value

The value of the ratio of the shortest distance to the longest distance in a minimum spanning tree.

# Author(s)

Aiba et al., 2013 modified by Adrien Taudiere

# References

Stubbs, WJ., and Wilson, JB. 2004. Evidence for limiting similarity in a sand dune community. Journal of Ecology 92: 557-567. Aiba, M., Katabuchi, M., Takafumi, H., Matsuzaki, S.S., Sasaki, T. & Hiura, T. 2013. Robustness of trait distribution metrics for community assembly studies under the uncertainties of assembly processes. Ecology, 94, 2873-2885.

```
## Not run:
data(finch.ind)
MinMaxMST(traits.finch[1:10,])
MinMaxMST(traits.finch[1:10,], gower.dist = FALSE)
MinMaxMST(traits.finch[1:10,], gower.dist = FALSE, scale.tr = FALSE)
## End(Not run)
```

Neigbourhood distance metrics

Coefficient of variation, mean, minimum and standard deviation of the nearest neigbourhood distance.

### **Description**

CVNND: Coefficient of variation of the nearest neigbourhood distance

MNND: Mean of the nearest neigbourhood distance

MinNND: Minimum of the nearest neigbourhood distance

SDNND: Standard deviation of the nearest neigbourhood distance

SDND: Standard deviation of the neigbourhood distance

MND: Mean of the neigbourhood distance

# Usage

```
CVNND(traits, div_range = FALSE, na.rm = FALSE, scale.tr = TRUE,
method.dist = "euclidian")

MNND(traits, div_range = FALSE, na.rm = FALSE, scale.tr = TRUE,
method.dist = "euclidian")

MinNND(traits, div_range = FALSE, na.rm = FALSE, scale.tr = TRUE,
method.dist = "euclidian")

SDNND(traits, div_range = FALSE, na.rm = FALSE, scale.tr = TRUE,
method.dist = "euclidian")

SDND(trait, div_range = FALSE, na.rm = FALSE)

MND(trait, div_range = FALSE, na.rm = FALSE)
```

### **Arguments**

traits	Trait vector (uni-trait metric) or traits matrix (Multi-traits metric), traits in column.
trait	Trait vector
div_range	Does metric need to be divided by the range? Default is no.
na.rm	If div_range=TRUE, a logical value indicating whether NA values should be stripped before the computation proceeds.
scale.tr	Does traits need to be scale before multi-traits metric calculation? Default is yes.
method.dist	Method to calculate the distance in case of multi-traits metric (function dist). Default is euclidian.

### Value

One value corresponding to the metric value.

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### Author(s)

Adrien Taudiere

#### References

Aiba, M., Katabuchi, M., Takafumi, H., Matsuzaki, S.S., Sasaki, T. & Hiura, T. 2013. Robustness of trait distribution metrics for community assembly studies under the uncertainties of assembly processes. Ecology, 94, 2873-2885. Jung, Vincent, Cyrille Violle, Cedric Mondy, Lucien Hoffmann, et Serge Muller. 2010. Intraspecific variability and trait-based community assembly: Intraspecific variability and community assembly. Journal of Ecology 98 (5): 1134-1140.

# **Examples**

```
data(finch.ind)
## Not run:
CVNND(traits.finch[,1])
CVNND(traits.finch[,1], div_range = TRUE, na.rm = TRUE)
CVNND(traits.finch)
CVNND(traits.finch, scale.tr = FALSE)
SDND(traits.finch[,1])
## End(Not run)
```

partvar

Variance partitioning accross nested scales

# **Description**

Variance partitioning accross nested scales using a decomposition (varcomp function) of variance on restricted maximum likelihood (REML) method (lme function). See Messier et al. 2010 for more information. barPartvar and piePartvar are associated plotting functions.

# Usage

```
partvar(traits, factors, printprogress = TRUE)
barPartvar(partvar, col.bar = NA, ...)
piePartvar(partvar, col.pie = NA, ...)
```

# **Arguments**

traits	Matrix of traits with traits in column
factors	A matrix of factors with the first column corresponds to the higher level factor, the second row the second higher level factor and so on.
printprogress	Logical value; print progress during the calculation or not.
partvar	The result of the partvar function.
col.bar	Vector of colors of bars
	Any additional arguments are passed to the pie function.
col.pie	Vector of color for pie.

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#### Value

An object of class "partvar" corresponding to a matrix of variance values with traits in rows and nested factors in column.

### Author(s)

Adrien Taudiere Julie Messier

### References

Messier, Julie, Brian J. McGill, et Martin J. Lechowicz. 2010. How do traits vary across ecological scales? A case for trait-based ecology: How do traits vary across ecological scales? Ecology Letters 13(7): 838-848. doi:10.1111/j.1461-0248.2010.01476.x.

#### See Also

```
piePartvar; barPartvar
```

# **Examples**

```
data(finch.ind)
cond<-seq(1,length(sp.finch)*2, by = 2)
genus <- as.vector(unlist(strsplit(as.vector(sp.finch),"_"))[cond])
res.partvar.finch <- partvar(traits = traits.finch,
factors = cbind(sites = as.factor(as.vector(ind.plot.finch)),
species = as.factor(as.vector(sp.finch)), genus = as.factor(genus)))
res.partvar.finch
oldpar<-par()
par(mfrow = c(2,2), mai = c(0.2,0.2,0.2,0.2))
piePartvar(res.partvar.finch, col = c("red", "olivedrab3", "blue", "purple"))
par(oldpar)
barPartvar(res.partvar.finch, col = c("red", "olivedrab3", "blue", "purple"))</pre>
```

plot.listofindex

Plot community assembly index

# Description

Plot community assembly index and confidence intervals using a list of index. S3 method for class listofindex.

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#### Usage

```
## S3 method for class 'listofindex'
plot(x, type = "normal",
col.index = c("red", "purple", "olivedrab3"), add.conf = TRUE,
color.cond = TRUE, val.quant = c(0.025, 0.975),
grid.v = TRUE, grid.h = TRUE, xlim = NULL, ylim = NULL,
cex.text = 0.8, plot.ask = FALSE, srt.text = 90, alpha = 0.4, ...)
```

# **Arguments**

x	A list of index and related null models obtained from to the as.listofindex function.
type	Type of plot. Possible type = "simple", "simple_range", "normal", "barplot" and "bytraits".
col.index	Vector of colors for index.
add.conf	Logical value; Add confidence intervals or not.
color.cond	Logical value; If color.cond = TRUE, color points indicate T-statistics values significatively different from the null model and grey points are not different from null model.
val.quant	Numeric vectors of length 2, giving the quantile to calculate confidence interval. By default val.quant = $c(0.025,0.975)$ for a bilateral test with alpha = $5\%$ .
grid.v	Logical value; print vertical grid or not
grid.h	Logical value; print horizontal grid or not
xlim	Numeric vectors of length 2, giving the x coordinates range
ylim	Numeric vectors of length 2, giving the y coordinates range
cex.text	Numeric value; the magnification to be used for text relative to the current setting of cex
plot.ask	Logical value; ask for plotting the next plot or not.
srt.text	Degree of rotation for text.
alpha	Degree of transparency for null models aera.
	Any additional arguments are passed to the plot function creating the core of the plot and can be used to adjust the look of resulting graph.

# **Details**

S3 method plot for class listofindex: -Normal type plot means, standard deviations, ranges and confidence intervals of T-statistics. -Simple\_range type plot means, standard deviations and range of T-statistics -Simple type plot T-statistics for each site and traits and the mean confidence intervals by traits -Barplot type plot means, standard deviations and confidence intervals of T-statistics in a barplot fashion -Bysites type plot each metrics for each sites -Bytraits type plot each metrics for each traits

### Value

None; used for the side-effect of producing a plot.

### Author(s)

Adrien Taudiere

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#### See Also

```
as.listofindex; plot.Tstats; ses.listofindex
```

```
data(finch.ind)
oldpar <- par(no.readonly = TRUE)</pre>
#The function ComIndex allow to choose your own function
#(like mean, range, variance...) to calculate customize index.
require(e1071)
funct <- c("mean(x, na.rm = TRUE)", "kurtosis(x, na.rm = TRUE)",</pre>
max(x, na.rm = TRUE) - min(x, na.rm = TRUE)
## Not run:
res.finch.sp_mn2 <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = "2", ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
res.finch.sp_mn2sp <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = "2sp", ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
res.finch.sp_mn2sp <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = "2sp", ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
#We can represent Standardized Effect Size (ses)
#using the function plot(as.listofindex(list1, list2, list3))
list.ind2 <- list(res.finch.sp_mn2, res.finch.sp_mn2sp)</pre>
index.list2 <- as.listofindex(list.ind2)</pre>
plot(index.list2, type = "bytraits")
plot(index.list2)
## End(Not run)
#This allows to calculation index per site
#for example using "tapply(x, sites, mean)".
funct <- c("tapply(x, ind.plot.finch, function(x) mean(x, na.rm = TRUE))",
"tapply(x, ind.plot.finch, function(x) kurtosis(x, na.rm = TRUE))",
"tapply(x, ind.plot.finch, function(x) max(x, na.rm = TRUE) -
min(x, na.rm = TRUE))")
##Null model 1 is trivial for this function
#because randomisation is within community only
```

```
## Not run:
res.finch.ind_mn1 <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = c(1,1,1), ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
res.finch.ind_mn2 <- ComIndex(traits = traits.finch, index = funct,</pre>
sp = sp.finch, nullmodels = c("2","2","2"), ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
####
#We can calculation metrics with or without intraspecific variance.
#Calculation of trait averages per population
#(name_sp_site is a name of a population)
#like in the function ComIndex
#and determine the site for each population (sites_bypop)
name_sp_sites = paste(sp.finch, ind.plot.finch, sep = "_")
traits.by.pop <- apply(traits.finch, 2 , function (x)</pre>
tapply(x, name_sp_sites, mean , na.rm = TRUE))
sites_bypop <- lapply(strsplit(paste(rownames(traits.by.pop), sep = "_"),</pre>
split = "_"), function(x) x[3])
funct.without IV <- c("tapply(x, unlist(sites_bypop),
function(x) mean(x, na.rm = TRUE))", "tapply(x, unlist(sites_bypop),
function(x) kurtosis(x, na.rm = TRUE))", "tapply(x, unlist(sites_bypop),
function(x) max(x, na.rm = TRUE) - min(x, na.rm = TRUE))")
funct.withIV <- c("tapply(x, ind.plot.finch, function(x)</pre>
mean(x, na.rm = TRUE))", "tapply(x, ind.plot.finch, function(x)
kurtosis(x, na.rm = TRUE))", "tapply(x, ind.plot.finch, function(x)
max(x, na.rm = TRUE) - min(x, na.rm = TRUE))")
res.finch.withIV <- ComIndex(traits = traits.finch, index = funct.withIV,</pre>
sp = sp.finch, nullmodels = c("2","2","2"), ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
res.finch.withoutIV <- ComIndex(traits = traits.finch, index = funct.withoutIV,</pre>
sp = sp.finch, nullmodels = c("2sp","2sp","2sp"), ind.plot = ind.plot.finch,
nperm = 9, print = FALSE)
## End(Not run)
####
#We can also represent T-statistics and custom index thanks to
#the plot.listofindex function.
## Not run:
res.finch <- Tstats(traits.finch, ind.plot = ind.plot.finch, sp = sp.finch,
nperm = 9, print = FALSE)
list.ind <- list(res.finch.withIV, res.finch.withoutIV ,res.finch)</pre>
```

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```
index.list1 <- as.listofindex(list.ind, namesindex =
c("mean", "kurtosis", "range", "mean.pop", "kurtosis.pop", "range.pop",
"T_IP.IC", "T_IC.IR", "T_PC.PR"))

class(index.list1)

plot(index.list1, type = "simple")
plot(index.list1, type = "simple_range")
plot(index.list1, type = "barplot")
plot(index.list1, type = "normal")

plot(index.list1, type = "bysites")
plot(index.list1, type = "bytraits")

## End(Not run)</pre>
```

plotCorTstats

Plot the bivariate relationships between T-statistics

# Description

Plot the bivariate relationships between the three T-statistics namely T\_IP.IC, T\_IC.IR and T\_PC.PR.

# Usage

```
plotCorTstats(tstats = NULL, val.quant = c(0.025, 0.975), add.text = FALSE, bysite = FALSE, col.obj = NULL, plot.ask = TRUE, multipanel = TRUE, ...)
```

# **Arguments**

tstats	The list resulting from the function Tstats.
val.quant	Numeric vector of length 2, giving the quantile to calculate confidence interval. By default val.quant = $c(0.025,0.975)$ for a bilateral test with alpha = $5\%$ .
add.text	Logical value; Add text or not.
bysite	Logical value; plot per site or by traits.
col.obj	Vector of colors for object (either traits or sites).
plot.ask	Logical value; Ask for new plot or not.
multipanel	Logical value. If TRUE divides the device to shown several traits graphics in the same device.
•••	Any additional arguments are passed to the plot function creating the core of the plot and can be used to adjust the look of resulting graph.

### Value

None; used for the side-effect of producing a plot.

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### Author(s)

Adrien Taudiere

### See Also

```
Tstats; plot.Tstats; plotSESvar
```

# **Examples**

```
data(finch.ind)
res.finch <- Tstats(traits.finch, ind.plot = ind.plot.finch,
sp = sp.finch, nperm = 9)

plotCorTstats(res.finch, bysite = FALSE)
plotCorTstats(res.finch, bysite = TRUE)</pre>
```

plotDistri

Plot function to represent density of trait values

# **Description**

Plot function to represent density of trait values

# Usage

```
plotDistri(traits = NULL, var.1 = NULL, var.2 = NULL, col.dens = NULL,
plot.ask = TRUE, ylim.cex = 1, cex.leg = 0.8, polyg = TRUE,
multipanel = TRUE, leg = TRUE)
```

# **Arguments**

traits	Matrix of traits with traits in column.
var.1	The first variable defines the division of each plots, in most case either a vector of species or name of sites.
var.2	The second variable define the division by color, in most case either a vector of species or name of sites.
col.dens	A vector of colors for the second variable.
plot.ask	Logical value; ask for plotting the next plot or not.
ylim.cex	Numeric value; the magnification to be used for range of y axe
cex.leg	Numeric value; the magnification to be used for legend relative to the current setting of cex
polyg	Logical value; do the mean distribution is full or empty
multipanel	Logical value. If TRUE divides the device to shown several traits graphics in the same device.
leg	Logical value; if TRUE print the legend.

# Value

None; used for the side-effect of producing a plot.

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### Author(s)

Adrien Taudiere

#### See Also

```
plotSpPop
```

```
data(finch.ind)
## Not run:
#Plot the distribution of trait values for populations,
#species, sites and regional scales.
### First, let try the distribution for all populations
#of Darwin finches.
par(mfrow = c(4,4), cex = 0.5)
plotDistri(traits.finch, sp.finch, ind.plot.finch, ylim.cex = 3,
plot.ask = FALSE, multipanel = FALSE, leg = FALSE)
### Then we can inverse the second and the third arguments
#to plot the distribution for all finches species.
par(mfrow = c(4,4), cex = 0.5)
plotDistri(traits.finch, ind.plot.finch, sp.finch, ylim.cex = 8,
plot.ask = FALSE, multipanel = FALSE, leg = FALSE)
### Only one trait to plot using leg = TRUE to plot the legend
par(mfrow=c(2,3))
plotDistri(as.matrix(traits.finch[,1]), ind.plot.finch, sp.finch,
    ylim.cex=8, plot.ask = FALSE, multipanel = FALSE, leg = TRUE, cex.leg=0.5)
### You can also plot trait distribution for all species in the region
par(mfrow = c(1,1), cex = 1)
plotDistri(traits.finch, rep("region", times = dim(traits.finch)[1]),
sp.finch, ylim.cex = 6, plot.ask = FALSE, leg = FALSE)
## End(Not run)
### You can also plot trait distribution for all sites
#without taking into account species identity
plotDistri(traits.finch, rep("toutes_sp", times = dim(traits.finch)[1]),
ind.plot.finch, ylim.cex = 3, plot.ask = FALSE)
```

plotRandtest 29

Plot result of observed indices values against null distribution

# Description

Function to plot result of observed indices values against null distribution.

# Usage

```
plotRandtest(x, alternative = c("greater", "less", "two-sided"), ...)
```

### **Arguments**

x An object of class listofindex, ComIndex, ComIndexMulti or Tstats.

alternative Indicates the alternative hypothesis and must be one of "two.sided", "greater" or

"less". You can specify just the initial letter. "greater" corresponds to positive

association, "less" to negative association.

... Any additional arguments are passed to the plot function creating the core of the

plot and can be used to adjust the look of resulting graph.

#### Value

None; used for the side-effect of producing a plot.

# Author(s)

Adrien Taudiere

### See Also

```
ComIndex; ComIndexMulti; Tstats; as.listofindex; plot.listofindex
```

```
data(finch.ind)
## Not run:
res.finch <- Tstats(traits.finch, ind.plot = ind.plot.finch,
sp = sp.finch, nperm = 99, print = FALSE)

par(mfrow = c(4,4))

plotRandtest(res.finch)
plotRandtest(res.finch, alter = "two-sided")

## End(Not run)</pre>
```

30 plotSESvar

|--|

### **Description**

Plot standardized effect size values against a variable

### Usage

```
plotSESvar(index.list, variable = NULL, ylab = "variable", color.traits = NULL, val.quant = c(0.025, 0.975), resume = FALSE, multipanel = TRUE)
```

### **Arguments**

index.list A list of index and the associate null models in the forme: list( index\_1 = index\_1\_observed, index\_1\_nm = null.model.index\_1,index\_2 = index\_2\_observed, index\_2\_nm = null.model.index\_2, ...). The variable against standardized effect sizes are plotted. variable ylab Label for the variable. color.traits A vector of colors corresponding to traits. val.quant Numeric vectors of length 2, giving the quantile to calculation confidence interval. By default val.quant = c(0.025,0.975) for a bilateral test with alpha = resume Logical value; resume = FALSE by default; Simplify the plot by plotting the mean and standard error for index value of multiple traits multipanel Logical value. If TRUE divides the device to shown several traits graphics in

### Value

None; used for the side-effect of producing a plot.

the same device.

# Author(s)

Adrien Taudiere

#### See Also

```
plot.listofindex; ses
```

```
data(finch.ind)
res.finch <- Tstats(traits.finch, ind.plot = ind.plot.finch, sp = sp.finch,
nperm = 9)

par(mfrow = c(2,2))
species.richness <- table(ind.plot.finch)
plotSESvar(as.listofindex(list(res.finch)), species.richness,
multipanel = FALSE)</pre>
```

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```
#Same plot with resume = TRUE.
par(mfrow = c(2,2))
plotSESvar(as.listofindex(list(res.finch)), species.richness,
resume = TRUE, multipanel = FALSE)
par(mfrow = c(1,1))
```

plotSpPop

Plot populations values against species values

### **Description**

Plot populations values against species values. The objectif is to see the contribution of intraspecific vs inter-specific variation to trait gradient.

# Usage

```
plotSpPop(traits = NULL, ind.plot = NULL, sp = NULL, col.ind = rgb(0.5, 0.5, 0.5, 0.5), col.pop = NULL, col.sp = NULL, col.site = NULL, resume = FALSE, p.val = 0.05, min.ind.signif = 10, multipanel = TRUE, col.nonsignif.lm = rgb(0, 0, 0, 0.5), col.signif.lm = rgb(1, 0.1, 0.1, 0.8), silent = FALSE)
```

# **Arguments**

traits	Individual Matrix of traits with traits in columns.
ind.plot	Factor defining the name of the plot in which the individual is.
sp	Factor defining the species which the individual belong to.
col.ind	Color for individual values.
col.pop	Color for populational mean values.
col.sp	Color for species mean values.
col.site	Color for sites mean values.
resume	Logical, if TRUE plot a simple form of the plot.
p.val	Choosen p.value to print significant linear relationship using linear model. Argument past to the lm funtion internally.
min.ind.signif	Minimum individual to print significant linear relationship.
multipanel	Logical value. If TRUE divides the device to shown several traits graphics in the same device.
col.nonsignif.l	Lm
	Color for non significant linear relationship.
col.signif.lm	Color for significant linear relationship.
silent	Logical value, if resume = FALSE do not print warning argument.

#### **Details**

Example of utilisation: Cornwell, W.K., Ackerly, D.D., 2009. Community assembly and shifts in plant trait distributions across an environmental gradient in coastal California. Ecological Monographs 79, 109-126.

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#### Value

None; used for the side-effect of producing a plot.

### Author(s)

Adrien Taudiere

#### See Also

```
plotDistri
```

### **Examples**

```
data(finch.ind)
plotSpPop(traits.finch, ind.plot.finch, sp.finch, silent = TRUE)
#If we change the value of the threshold
#(alpha = 10% instead of 5%
#and the minimum individual to represent significativity
#fixed to 3 instead of 10 by default)
#we can see some significant relationships.
plotSpPop(traits.finch, ind.plot.finch, sp.finch, p.val = 0.1,
min.ind.signif = 3, silent = TRUE)
#For a more simple figure, add the option resume = TRUE.
#Again if we change the value of the threshold
\#(alpha = 10\% instead of 5\%
#and the minimum individual to represent significativity
# fixed to 3 instead of 10 by default)
#we can see some significant relationships.
plotSpPop(traits.finch, ind.plot.finch, sp.finch, silent = TRUE,
resume = TRUE, col.pop = "grey")
plotSpPop(traits.finch, ind.plot.finch, sp.finch, silent = TRUE,
resume = TRUE, col.pop = "grey", col.sp = "black")
plotSpPop(traits.finch, ind.plot.finch, sp.finch, silent = TRUE,
resume = TRUE, col.pop = "grey", col.sp = "black",
p.val = 0.1, min.ind.signif = 3)
```

plotSpVar

Plot populations values against species values

# **Description**

Plot populations values against species values. The objectif is to see the contribution of intraspecific vs inter-specific variation to trait gradient. plotSpVar 33

### Usage

```
plotSpVar(traits = NULL, ind.plot = NULL, sp = NULL, variable = NULL, col.ind = rgb(0.5, 0.5, 0.5, 0.5), col.pop = NULL, col.sp = NULL, col.site = NULL, resume = FALSE, p.val = 0.05, min.ind.signif = 10, multipanel = TRUE, col.nonsignif.lm = rgb(0, 0, 0, 0.5), col.signif.lm = rgb(1, 0.1, 0.1, 0.8), silent = FALSE)
```

# **Arguments**

	traits	Individual Matrix of traits with traits in columns.
	ind.plot	Factor defining the name of the plot in which the individual is.
	sp	Factor defining the species which the individual belong to.
	variable	A matrix of variables corresponding to each site (in rows) and each trait (in columns). If you want to plot all traits against one variable, variable can be a vector of numerical values.
	col.ind	Color for individual values.
	col.pop	Color for populational mean values.
	col.sp	Color for species mean values.
	col.site	Color for sites mean values.
	resume	Logical, if TRUE plot a simple form of the plot.
	p.val	Choosen p.value to print significant linear relationship using linear model. Argument past to the lm funtion internally.
	min.ind.signif	Minimum individual to print significant linear relationship.
	multipanel	Logical value. If TRUE divides the device to shown several traits graphics in the same device.
col.nonsignif.lm		
		Color for non significant linear relationship.
	col.signif.lm	Color for significant linear relationship.
	silent	Logical value, if resume = FALSE do not print warning argument.

# Value

None; used for the side-effect of producing a plot.

# Author(s)

Adrien Taudiere

# See Also

```
plotDistri
```

```
data(finch.ind)
#Random variable for this example
variable <- c(1,5,15,6,3,25)</pre>
```

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```
plotSpVar(traits.finch, ind.plot.finch, sp.finch, variable,
silent = TRUE)
#If we change the value of the threshold
#(alpha = 10% instead of 5%
#and the minimum individual to represent significativity
#fixed to 3 instead of 10 by default)
#we can see some significant relationships.
plotSpVar(traits.finch, ind.plot.finch, sp.finch, variable,
p.val = 0.1, min.ind.signif = 3, silent = TRUE)
#For a more simple figure, add the option resume = TRUE.
#Again if we change the value of the threshold
#(alpha = 10% instead of 5%
#and the minimum individual to represent significativity
# fixed to 3 instead of 10 by default)
#we can see some significant relationships.
plotSpVar(traits.finch, ind.plot.finch, sp.finch, variable,
silent = TRUE, resume = TRUE, col.pop = "grey")
plotSpVar(traits.finch, ind.plot.finch, sp.finch, variable,
silent = TRUE, resume = TRUE, col.pop = "grey", col.sp = "black")
plotSpVar(traits.finch, ind.plot.finch, sp.finch, variable,
silent = TRUE, resume = TRUE, col.pop = "grey", col.sp = "black",
p.val = 0.1, min.ind.signif = 3)
```

Pval

Calcul of p-value for object of class Tstats, ComIndex, ComIndexMulti and listofindex

# **Description**

Calcul of p-value for object of class Tstats, ComIndex, ComIndexMulti and listofindex. This test equates to finding the quantile in exp in which obs would be found (under a one-tailed test).

# Usage

```
Pval(x, na.rm = TRUE)
```

### **Arguments**

x An object of class Tstats, ComIndex, ComIndexMulti or listofindex.

na.rm A logical value indicating whether NA values should be stripped before the computation proceeds.

### Value

A list of p-value for each metrics, traits and grouping if needed (e.g. sites)

RaoRel 35

#### Author(s)

Adrien Taudiere

#### **Examples**

```
data(finch.ind)
res.finch <- Tstats(traits.finch, ind.plot = ind.plot.finch,
sp = sp.finch, nperm = 9, print = FALSE)
Pval(res.finch)</pre>
```

RaoRel

Alpha, gamma and beta-components for taxonomic, functional and phylogenetic diversity

### **Description**

The Rao function computes alpha, gamma and beta-components for taxonomic, functional and phylogenetic diversity with the Rao index. The script integrates two functions: "Qdecomp", by Villeger et Mouillot (J Ecol, 2008) modified by Wilfried Thuiller, and "disc", by S. Pavoine, in the package ade4. For a regional assemblage of C local communities gamma = mean(alpha) + beta, where: gamma is the diversity of the regional pool, alpha is the diversity of the local community and beta is the turn over between local communities diversity is estimated with the Rao quadratic entropy index (Rao 1982)

# Usage

```
RaoRel(sample, dfunc, dphyl, weight = FALSE, Jost = FALSE,
structure = NULL)
```

#### **Arguments**

sample	Community matrix of abundance (c $x$ s) of the $s$ species for the c local communities.
dfunc	matrix (s x s) or dist object with pairwise functional trait distances between the s species
dphyl	As dfunct but for phylogenetic distances
weight	Defining if the correction by Villeger & Mouillot (J Ecol, 2008) is applied or not
Jost	Defining if the Jost correction is applied (Jost 2007)
structure	A data frame containing the name of the group to which samples belong see de Bello et al. 2011 for more details.

### **Details**

NA are not allowed in "locabrel <- abundances/ablocist". NA are automatically replaced by 0 in "sample". This function use the function "Qdecomp" by Sebastien Villeger & David Mouillot (J Ecol, 2008) modified by Wilfried Thuiller and the function disc originally proposed by Sandrine Pavoine.

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#### Value

The results are organized for Taxonomic diversity (\$TD), Functional diversity (\$FD) and phylogenetical diversity (\$PD). Beta and gamma diversities are calculated for the whole data set and for each pair of samples ("Pairwise\_samples"):

\$Richness\_per\_plot(number of species per sample)

\$Relative\_abundance (species relative abundances per plot)

\$Pi (species regional relative abundance)

\$Wc (weigthing factor),

\$Mean\_Alpha (mean aplpha diversity; for taxonomic diversity the Simpson index is calculated)

\$Alpha (alpha diversity for each sample; for taxonomic diversity the Simpson index is calculated)

\$Gamma (gamma diversity; for taxonomic diversity the Simpson index is calculated)

\$Beta\_add (Gamma-Mean\_Alpha)

\$Beta\_prop (Beta\_add\*100/Gamma)

\$Pairwise\_samples\$Alpha (mean alpha for each pair of samples)

\$Pairwise\_samples\$Gamma (gamma for each pair of samples)

\$Pairwise\_samples\$Beta\_add (beta for each pair of samples as Gamma-Mean\_Alpha)

\$Pairwise\_samples\$Beta\_prop (beta for each pair of samples as Beta\_add\*100/Gamma)

### Author(s)

Francesco De Bello et al., 2011 modified by Adrien Taudiere

### References

De Bello, Francesco, Sandra Lavorel, Cecile H. Albert, Wilfried Thuiller, Karl Grigulis, Jiri Dolezal, stepan Janecek, et Jan Leps. 2011. Quantifying the relevance of intraspecific trait variability for functional diversity: Intraspecific variability in functional diversity. Methods in Ecology and Evolution 2: 163-174.

```
data(finch.ind)
## Not run:
comm <- t(table(ind.plot.finch,1:length(ind.plot.finch)))
comm.sp <- table(sp.finch, ind.plot.finch)
class(comm.sp) <- "matrix"

traits.finch.sp <- apply( apply(traits.finch, 2, scale ), 2,

function(x) tapply(x, sp.finch, mean, na.rm = TRUE))

mat.dist <- as.matrix(dist(traits.finch.sp))^2

res.rao <- RaoRel(sample = as.matrix(comm.sp), dfunc = mat.dist, dphyl = NULL,
weight = FALSE, Jost = FALSE, structure = NULL)

function(x) tapply(x, sp.finch, mean, na.rm=TRUE))

mat.dist <- as.matrix(dist(traits.finch.sp))^2</pre>
```

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```
res.rao <- RaoRel(sample=as.matrix(comm.sp), dfunc=mat.dist, dphyl=NULL,</pre>
weight=FALSE, Jost=FALSE, structure=NULL)
witRao <- res.rao$FD$Mean_Alpha #overall within species variance</pre>
betRao <- res.rao$FD$Beta_add  #between species variance</pre>
totRao <- res.rao$FD$Gamma
                                 #the total variance
witRao+betRao
totRao
#Now let"s take the abundance to calculate Rao diversity.
res.rao.w <- RaoRel(sample = as.matrix(comm.sp), dfunc = mat.dist, dphyl = NULL,</pre>
weight = TRUE, Jost = FALSE, structure = NULL)
res.rao.w <- RaoRel(sample=as.matrix(comm.sp), dfunc=mat.dist, dphyl=NULL,</pre>
weight=TRUE, Jost=FALSE, structure=NULL)
witRao.w <- res.rao.w$FD$Mean_Alpha #overall within species variance</pre>
betRao.w <- res.rao.w$FD$Beta_add</pre>
                                      #between species variance
                                      #the total variance
totRao.w <- res.rao.w$FD$Gamma
witRao w
betRao.w
#Plot the results
barplot(cbind(c(witRao.w, betRao.w), c(witRao, betRao)),
names.arg = c("abundance" ,"presence"),
legend.text = c("within species", "between species"),
ylab = "Rao", ylim = c(0,10))
#We can do this analysis for each trait separately.
#First we need to replace (or exclude) NA values.
#For this example, we use the package mice to complete the data.
comm <- t(table(ind.plot.finch,1:length(ind.plot.finch)))</pre>
library(mice)
traits = traits.finch
traits=traits.finch
mice <- mice(traits.finch)</pre>
traits.finch.mice <- complete(mice)</pre>
traits.finch.mice.sp <- apply(apply(traits.finch.mice, 2, scale ), 2,</pre>
```

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```
function(x) tapply(x, sp.finch, mean, na.rm = TRUE))
function(x) tapply(x, sp.finch, mean, na.rm = TRUE))
function(x) tapply(x, sp.finch, mean, na.rm=TRUE))
trait.rao.w <- list()</pre>
witRao.w.bytrait <- c()</pre>
betRao.w.bytrait <- c()</pre>
for (t in 1 : 4){
  trait.rao.w[[t]] <- RaoRel(sample = as.matrix(comm.sp),</pre>
  dfunc = dist(traits.finch.mice.sp[,t]), dphyl = NULL, weight = TRUE,
  Jost = FALSE, structure = NULL)
}
for(t in 1:4){
  trait.rao.w[[t]] <- RaoRel(sample=as.matrix(comm.sp),</pre>
  dfunc=dist(traits.finch.mice.sp[,t]), dphyl=NULL, weight=TRUE,
  Jost=FALSE, structure=NULL)
  witRao.w.bytrait <- c(witRao.w.bytrait, trait.rao.w[[t]]$FD$Mean_Alpha)</pre>
 betRao.w.bytrait <- c(betRao.w.bytrait, trait.rao.w[[t]]$FD$Beta_add)</pre>
#Plot the results by traits.
barplot(t(cbind( witRao.w.bytrait, betRao.w.bytrait)),
names.arg = colnames(traits.finch),
legend.text = c("within species", "between species"),
ylab = "Rao", ylim = c(0,1.5))
## End(Not run)
```

ses

Standardized effect size and confidence interval for a matrix of statistics

# Description

calculation standardized effect size and confidence interval for a matrix of statistics and the related null model expressed as a list or as an array. Internal function use by other functions of the package. You can transpose the observed matrix to represent either the SES by traits or by plots.

# Usage

```
ses(obs = NULL, nullmodel = NULL, val.quant = c(0.025, 0.975))
```

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#### **Arguments**

obs Observed matrix or vector of values.

nullmodel Either a list or an array of three (two for a vector of observed values) dimensions

corresponding to the null model permutations.

val.quant Numeric vectors of length 2, giving the quantile to calculation confidence in-

terval. By default val.quant = c(0.025,0.975) for a bilateral test with alpha =

5%.

#### **Details**

Warning: to detect automatically the correspondence between dimension of observed matrix and null model list or array, observed matrix needs to have different numbers of rows and columns. In the case of same row and column number, please verify manually the correspondance beatween the rows of the observed matrix and the null model array.

#### Value

A list of three components:

\$ses Observed value of standardized effect size.
\$ses.inf Lower limit of the confidence interval.
\$ses.sup Upper limit of the confidence interval.

#### Author(s)

Adrien Taudiere

#### See Also

```
plot.listofindex; plotSESvar; ses.listofindex
```

#### **Examples**

```
data(finch.ind)
res.finch <- Tstats(traits.finch, ind.plot = ind.plot.finch,
sp = sp.finch, nperm = 9)
ses(res.finch$Tstats$T_IP.IC, res.finch$Tstats$T_IP.IC_nm)</pre>
```

ses.listofindex

Standardized effect size for a list of index.

### **Description**

Standardized effect size and confidence interval for a list of index.

## Usage

```
ses.listofindex(index.list = NULL, val.quant = c(0.025, 0.975))
```

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#### **Arguments**

index.list A list of index obtain using the function as.listofindex.

val.quant Numeric vectors of length 2, giving the quantile to calculation confidence in-

terval. By default val.quant = c(0.025,0.975) for a bilateral test with alpha =

5%.

#### Value

A list which each component correspond to the result of the ses function for an index. Further, each component is a list of three components:

\$ses Observed value of standardized effect size.
\$ses.inf Lower limit of the confidence interval.
\$ses.sup Upper limit of the confidence interval.

## Author(s)

Adrien Taudiere

#### See Also

```
as.listofindex; ses
```

# **Examples**

```
data(finch.ind)
## Not run:
res.finch <- Tstats(traits.finch, ind.plot = ind.plot.finch, sp = sp.finch,</pre>
nperm = 9, print = FALSE)
#calculation of means by population (name_sp_site is a population)
#like in the function ComIndex and determine the site
#for each population (sites_bypop)
name_sp_sites = paste(sp.finch, ind.plot.finch,sep = "_")
traits.by.pop <- apply(traits.finch, 2 , function (x)
tapply(x, name\_sp\_sites, mean , na.rm = TRUE))
require(e1071)
sites_bypop <- lapply(strsplit(paste(rownames(traits.by.pop), sep = "_")</pre>
, split = "_"), function(x) x[3])
funct.withoutIV <- c("tapply(x, unlist(sites_bypop),</pre>
function(x) mean(x, na.rm=TRUE))",
"tapply(x, unlist(sites_bypop), function(x) kurtosis(x, na.rm=TRUE))",
"tapply(x, unlist(sites_bypop), function(x) max(x, na.rm = TRUE)
- min(x, na.rm = TRUE))",
"tapply(x, unlist(sites_bypop), function(x) CVNND(x))" )
funct.withIV <- c("tapply(x, ind.plot.finch,</pre>
function(x) mean(x, na.rm = TRUE))",
"tapply(x, ind.plot.finch, function(x) kurtosis(x, na.rm = TRUE))",
```

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```
"tapply(x, ind.plot.finch, function(x) max(x, na.rm = TRUE)
- min(x, na.rm = TRUE) )",
"tapply(x, ind.plot.finch, function(x) CVNND(x))" )
res.finch.withIV <- ComIndex(traits = traits.finch,</pre>
index = funct.withIV, sp = sp.finch, nullmodels = rep("2", times=4),
ind.plot = ind.plot.finch, nperm = 9, print = FALSE)
res.finch.withoutIV <- ComIndex(traits = traits.finch,</pre>
index = funct.withoutIV, sp = sp.finch, nullmodels = rep("2sp", times=4),
ind.plot = ind.plot.finch, nperm = 9, print = FALSE)
##Plot T-statistics and custom metrics thanks to
#the plot.listofindex function.
list.ind <- list(res.finch.withIV, res.finch.withoutIV, res.finch)</pre>
index.list <- as.listofindex(list.ind,</pre>
 class(index.list)
plot(index.list, plot.ask = FALSE)
ses.list <- ses.listofindex(index.list)</pre>
ses list
attributes(ses.list)
#### An other way to see "ses values"
# Custom theme (from rasterVis package)
require(rasterVis)
my.theme <- BuRdTheme()</pre>
# Customize the colorkey
my.ckey <- list(col = my.theme$regions$col)</pre>
levelplot(t(rbind(ses.list[[1]]$ses, ses.list[[2]]$ses,
ses.list[[3]]$ses, ses.list[[4]]$ses)), colorkey = my.ckey,
par.settings = my.theme,border = "black")
levelplot(t(rbind(ses.list[[1]]$ses>ses.list[[1]]$ses.sup,
ses.list[[2]]$ses>ses.list[[2]]$ses.sup,
ses.list[[3]]$ses>ses.list[[3]]$ses.sup,
ses.list[[4]]$ses>ses.list[[4]]$ses.sup)),
colorkey = my.ckey, par.settings = my.theme,border = "black")
#For all metrics of the list of index
ses.list.levelplot <- c()</pre>
for(i in 1: length(ses.list)){
ses.list.levelplot <- rbind(ses.list.levelplot, ses.list[[i]]$ses)</pre>
}
```

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```
levelplot(t(ses.list.levelplot), colorkey = my.ckey,
par.settings = my.theme,border = "black")
## End(Not run)
```

SumBL

Sum of branch length of a classification dendrogram (Petchey and Gaston, 2002)

#### **Description**

Sum of branch length of a classification dendrogram (Petchey and Gaston, 2002)

#### Usage

```
SumBL(traits, gower.dist = TRUE, method.hclust = "average",
scale.tr = TRUE, method.dist = "euclidian")
```

## **Arguments**

traits Traits matrix (traits in column)

gower.dist Calculate gower distance using the function gowdis from package FD.

method.hclust Define the method for the hclust function (default is "average" i.e. UPGMA).

scale.tr Does traits need to be scale before multi-traits metric calculation? Only use when gower.dist = FALSE. Default is yes.

method.dist Method to calculate the distance in case of multi-traits metric (function dist).

Only use when gower.dist = FALSE. Default is euclidian.

#### Value

The value of the sum of branch length from a classification dendrogram of traits.

## Author(s)

Adrien Taudiere

## References

Petchey, OL., and Gaston, KJ. 2002. Functional diversity (FD), species richness and community composition. Ecology Letters 5:402-411

#### **Examples**

```
## Not run:
data(finch.ind)
SumBL(traits.finch)
SumBL(traits.finch, gower.dist = FALSE)
```

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## End(Not run)

traitflex.anova

Variance decomposition for a given trait used in decompCTRE

# Description

This function decomposes variation of trait values within a community into three sources: (i) the intraspecific trait variability, (ii) the variability due to species turnover and (iii) their covariation is also separated. This decomposition is computed for the whole variation in the trait values and, The formula specified, across the contribution of various explanatory variables considered in the model. S3 method plot summarizes graphically the decomposition of trait variation, obtained with the traitflex anova function. Print is an other S3 method for object of class traitflex.

# Usage

```
traitflex.anova(formula, specif.avg, const.avg, ...)
## S3 method for class 'traitflex'
plot(x, plot.total = FALSE, use.percentage = TRUE,
plot.covar = FALSE, cumul = FALSE,
legend.pos = if (plot.total) "topleft" else "topright",
plot.res = TRUE, ...)
## S3 method for class 'traitflex'
print(x, ...)
```

# Arguments

formula	The formula parameter must be a one-sided formula, i.e. starting with a tilde character. The response variable is specified by the next two arguments, specif.avg and const.avg.	
specif.avg	Vector with community trait composition values for a single trait. It is calculated from trait values specific to each community (i.e. trait values for individual species are 'specific' to each plot, or habitat, where the species is found)	
const.avg	Vector with community trait composition values for a single trait. It is calculated from average (fixed) trait values of individual species (i.e. fixed trait value for individual species used for all habitats where the species is found)	
X	An object of class traitflex.	
plot.total	Logical value; if TRUE plot not only the individual components of variation, but also the total variation. This is useful particularly when the decomposition was done with non-trivial formula (i.e. with explanatory variables)	
use.percentage	Logical value; if TRUE the individual plotted sources of trait variation are shown as percentages of the total variation, on 0-100 scale.	
plot.covar	Logical value; if TRUE the covariance between within-species trait variability and the variability due to species composition turnover is plotted as yet another category within the stacked bars. The plot.covar argument is entirely ignored when plotting traitflex object fitted with a formula without any predictor variables.	

cumul	Logical value; if TRUE values are shown in a cumulative way.
legend.pos	This argument allows you to specify the position of graph legend. Thus argument is entirely ignored when plotting traitflex object created with a formula without predictors
plot.res	Logical value; if resume = FALSE plot is not shown but the table of values used to print the plot is return.
	Optional additional arguments.

#### **Details**

The formula parameter must be a one-sided formula, i.e. starting with a tilde character. The response variable is specified by the next two arguments, specif.avg and const.avg.

#### Value

An object of class traitflex. There are print and plot methods available for it. The object contains decomposition of sum of squares into intraspecific variation component, compositional variation component, their covariation and total in a SumSq element. This is a data frame with multiple rows if predictors were specified in formula argument. The RelSumSq element contains the same table relativized to unit row totals. Finally, the anova.turnover, anova.total, and anova.diff elements contain the three aov objects used to decompose the variation.

#### Author(s)

Jan Leps et al., 2011 modified by Adrien Taudiere

#### References

Leps, Jan, Francesco de Bello, Petr Smilauer and Jiri Dolezal. 2011. Community trait response to environment: disentangling species turnover vs intraspecific trait variability effects. Ecography 34 (5): 856-863.

#### See Also

```
print.traitflex; plot.traitflex; decompCTRE
```

Tstats	Computing observed T-statistics (T for Traits) and null expectations.

## **Description**

Computing observed T-statistics (T for Traits) as three ratios of variance, namely T\_IP.IC, T\_IC.IR and T\_PC.PR. This function can also return the distribution of this three statistics under null models.

#### **Usage**

```
Tstats(traits, ind.plot, sp, reg.pool = NULL, nperm = 99, printprogress = TRUE)
sum_Tstats(x, val.quant = c(0.025, 0.975), type = "all")
## S3 method for class 'Tstats'
barplot(height, val.quant = c(0.025, 0.975),
col.index = c("red", "purple", "olivedrab3", "white"), ylim = NULL, ...)
## S3 method for class 'Tstats'
plot(x, type = "normal", col.index = c("red", "purple", "olivedrab3"),
add.conf = TRUE, color.cond = TRUE, val.quant = c(0.025, 0.975), ...)
## S3 method for class 'Tstats'
print(x, ...)
## S3 method for class 'Tstats'
summary(object, ...)
```

#### **Arguments**

traits Individual Matrix of traits with traits in columns. For one trait, use as.matrix().

ind.plot Factor defining the name of the plot in which the individual is.

sp Factor defining the species which the individual belong to.

reg.pool Regional pool data for traits. If not informed, 'traits' is considered as the re-

gional pool. This matrix need to be larger (more rows) than the matrix "traits".

Use only for null model 2.

nperm Number of permutations. If NULL, only observed values are returned;

printprogress Logical value; print progress during the calculation or not.

x An object of class Tstats.height An object of class Tstats.object An object of class Tstats.

val.quant Numeric vectors of length 2, giving the quantile to calculation confidence in-

terval. By default val.quant = c(0.025,0.975) for a bilateral test with alpha =

5%.

ylim Numeric vectors of length 2, giving the y coordinates range

col.index A vector of three color correspond to the three T-statistics.

color.cond Logical value; If color.cond = TRUE, color points indicate T-statistics values

significatively different from the null model and grey points are not different

from null model.

type For the plot function, type of plot. Possible type = "simple", "simple\_range",

"normal", "barplot" and "bytraits". For the summary function, type of summary

statistics. Either "binary", "percent", "p.value", "site" or "all".

add. conf Logical value; Add confidence intervals or not.

. . Any additional arguments are passed to the plot function creating the core of the

plot and can be used to adjust the look of resulting graph. See plot.listofindex

for more arguments.

#### **Details**

S3 method plot: -Normal type plot means, standard deviations, ranges and confidence intervals of T-statistics. -Simple\_range type plot means, standard deviations and range of T-statistics -Simple type plot T-statistics for each site and traits and the mean confidence intervals by traits -Barplot type plot means, standard deviations and confidence intervals of T-statistics in a barplot fashion -Bysites type plot each metrics for each sites -Bytraits type plot each metrics for each traits

S3 method print: print the structure if the object of class Tstats

S3 method summary: print the summary statistics of the three T-statistics

Method summary sum\_Tstats: -Binary type only test if a T-statistics is significatively different from the null expectation for each trait. -Percent type determine the percentage of sites were the T-statistics is significatively different from the null expectation for each trait. Asterix shows global significance of the test. -P-value type determine the p-value (two unilateral tests) of the T-statistics for each trait and sites. -Site type allows to know in which sites T-statistics deviate from the null expectation. -All type do all the precedent type of summary.

#### Value

A list of statistics:

\$tstats\$Tstats\$T\_IP.IC

Observed ratio between variance of individuals in populations and individuals in communities

\$tstats\$Tstats\$T\_IC.IR

Observed ratio between variance of individuals in communities and individuals in the region

\$tstats\$Tstats\$T\_PC.PR

Observed ratio between variance of populations in communities and populations in the region

\$tstats\$Tstats\$T\_IP.IC\_nm

If nperm is numeric; Result of simulation for T\_IP.IC

\$tstats\$Tstats\$T\_IC.IR\_nm

If nperm is numeric; Result of simulation for T\_IC.IR

\$tstats\$Tstats\$T\_PC.PR\_nm

If nperm is numeric; Result of simulation for T\_PC.PR

\$variances\$var\_IP

variance of individuals within populations

\$variances\$var\_PC

variance of populations within communities

\$variances\$var\_CR

variance of communities within the region

\$variances\$var\_IC

variance of individuals within communities

\$variances\$var\_PR

variance of populations within the region

\$variances\$var\_IR

variance of individuals within the region

\$variances\$var\_IP\_nm1

variance of individuals within populations in null model 1

\$variances\$var\_PC\_nm2sp

variance of populations within communities in null model 2sp

call of the function Tstats

#### Author(s)

\$call

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#### References

Violle, Cyrille, Brian J. Enquist, Brian J. McGill, Lin Jiang, Cecile H. Albert, Catherine Hulshof, Vincent Jung, et Julie Messier. 2012. The return of the variance: intraspecific variability in community ecology. Trends in Ecology & Evolution 27 (4): 244-252. doi:10.1016/j.tree.2011.11.014.

## See Also

ComIndex; ComIndexMulti; plotCorTstats; plotSESvar; plot.listofindex

#### **Examples**

```
data(finch.ind)
res.finch <- Tstats(traits.finch, ind.plot = ind.plot.finch,</pre>
sp = sp.finch, nperm = 9, print = FALSE)
res.finch
#Tstats class is associated to S3 methods plot, barplot and summary
plot(res.finch)
## Not run:
plot(res.finch, type = "simple")
plot(res.finch, type = "simple_range")
plot(res.finch, type = "barplot")
plot(res.finch, type = "bysites")
plot(res.finch, type = "bytraits")
## End(Not run)
attributes(sum_Tstats(res.finch))
head(sum_Tstats(res.finch)$p.value, 10)
sum_Tstats(res.finch, type = "binary")
sum_Tstats(res.finch, type = "percent")
```

```
sum_Tstats(res.finch, type = "site")
sum_Tstats(res.finch, type = "p.value")
sum_Tstats(res.finch, type = "all")
barplot(res.finch)
attributes(sum_Tstats(res.finch))
head(sum_Tstats(res.finch)$p.value, 10)
#### An other way to see "ses values" of T-statistics
# Custom theme (from rasterVis package)
require(rasterVis)
my.theme <- BuRdTheme()</pre>
# Customize the colorkey
my.ckey <- list(col = my.theme$regions$col)</pre>
levelplot(t(ses(res.finch$Tstats$T_IP.IC,res.finch$Tstats$T_IP.IC_nm)$ses),
colorkey = my.ckey, par.settings = my.theme,border = "black")
## Not run:
#### Use a different regional pool than the binding of studied communities
#create a random regional pool for the example
reg.p <- rbind(traits.finch, traits.finch[sample(1:2000,300), ])</pre>
res.finch2 <- Tstats(traits.finch, ind.plot = ind.plot.finch,</pre>
    sp = sp.finch, reg.pool=reg.p, nperm = 9, print = FALSE)
    plot(as.listofindex(list(res.finch, res.finch2)))
    #### Use a different regional pool for each communities
#create a random regional pool for each communities for the example
list.reg.p <- list(</pre>
traits.finch[sample(1:290,200), ], traits.finch[sample(100:1200,300), ],
traits.finch[sample(100:1500,\ 1000),\ ],\ traits.finch[sample(300:800,300),\ ],
traits.finch[sample(1000:2000, 500), ], traits.finch[sample(100:900, 700), ] )
# Warning: the regional pool need to be larger than the observed communities
table(ind.plot.finch)
# For exemple, the third community need a regional pool of more than 981 individuals
res.finch3 <- Tstats(traits.finch, ind.plot = ind.plot.finch,</pre>
    sp = sp.finch, reg.pool=list.reg.p, nperm = 9, print = FALSE)
    plot(as.listofindex(list(res.finch, res.finch2, res.finch3)))
## End(Not run)
```

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