Package 'mobr'

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Title Measurement of Biodiversity

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Description Functions for calculating metrics for the measurement biodiversity and its changes across scales, treatments, and gradients. The methods implemented in this package are described in:
Chase, J.M., et al. (2018) <doi:10.1111/ele.13151>,
McGlinn, D.J., et al. (2019) <doi:10.1111/2041-210X.13102>,
McGlinn, D.J., et al. (2020) <doi:10.1101/851717>, and
McGlinn, D.J., et al. (2023) <doi:10.1101/2023.09.19.558467>.

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Suggests knitr, rmarkdown, testthat, methods

Language en-US

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Contents

avg_nn_dist *Compute average nearest neighbor distance*

Description

This function computes the average distance of the next nearest sample for a given set of coordinates. This method of sampling is used by the function `rarefaction` when building the spatial, sample-based rarefaction curves (sSBR).

Usage

```
avg_nn_dist(coords)
```

Arguments

`coords`	a matrix with n-dimensional coordinates

Value

a vector of average distances for each sequential number of accumulated nearest samples.

Examples

```
# transect spatial arrangement
transect = 1:100
avg_nn_dist(transect)
grid = expand.grid(1:10, 1:10)
avg_nn_dist(grid)
oldpar <- par(no.readonly = TRUE)
par(mfrow=c(1,2))
plot(avg_nn_dist(transect), type='o', main='transect',
     xlab='# of samples', ylab='average distance')
# 2-D grid spatial arrangement
plot(avg_nn_dist(grid), type='o', main='grid',
     xlab='# of samples', ylab='average distance')
par(oldpar)
```

calc_beta_div *Calculate beta diversity from sites by species table.*

Description

A wrapper for the function `calc_comm_div` that only returns scales = 'beta'

Usage

```
calc_beta_div(abund_mat, index, effort = NA, C_target_gamma = NA, ...)
```

Arguments

abund_mat	Abundance based site-by-species table. Species as columns
index	The calculated biodiversity indices. The options are • N ... Number of individuals (total abundance) • S ... Number of species • S_n ... Rarefied or extrapolated number of species for n individuals • S_C ... Estimate species richness of a given level of coverage by C_target_gamma • S_asymp ... Estimated asymptotic species richness • f_0 ... Estimated number of undetected species • pct_rare ... The percent of rare species as defined by rare_thres • PIE ... Hurlbert's PIE (Probability of Interspecific Encounter) • S_PIE ... Effective number of species based on PIE See *Details* for additional information on the biodiversity statistics.
effort	The standardized number of individuals used for the calculation of rarefied species richness. This can a be single integer or a vector of integers.
C_target_gamma	When computing coverage based richness (S_C) then this argument can be used to specify the coverage to be used for the gamma scale richness estimate. This defaults to NA in which case the target cover is computed by calc_C_target (i.e., the largest allowable sample size).
...	other arguments to pass to calc_comm_div

See Also

calc_comm_div

Examples

```
data(inv_comm)
beta_metrics = calc_beta_div(inv_comm, 'S_n', effort = c(5, 10))
beta_metrics
```

---

calc_chao1 *Estimation of species richness*

Description

calc_chao1 estimates the number of species at the asymptote (S_asymp) of the species accumulation curve based on the methods proposed in Chao (1984, 1987, 2005).

Usage

```
calc_chao1(x)
```

Arguments

x	a vector of species abundances or a site-by-species matrix

Details

This function is a trimmed version of `iNext::ChaoRichness`. T. C. Hsieh, K. H. Ma and Anne Chao are the original authors of the `iNEXT` package.

Value

a vector of species richness estimates

References

Chao, A. (1984) Nonparametric estimation of the number of classes in a population. Scandinavian Journal of Statistics, 11, 265-270.

Chao, A. (1987) Estimating the population size for capture-recapture data with unequal catchability. Biometrics, 43, 783-791.

Chao, A. (2005) Species estimation and applications. Pages 7907-7916 in N. Balakrishnan, C. B. Read, and B. Vidakovic, editors. Encyclopedia of statistical sciences. Second edition, volume 12. Wiley, New York, New York, USA.

Examples

```
data(inv_comm)
calc_chao1(inv_comm)
```

`calc_comm_div` *Calculate biodiversity statistics from sites by species table.*

Description

Calculate biodiversity statistics from sites by species table.

Usage

```
calc_comm_div(
  abund_mat,
  index,
  effort = NA,
  extrapolate = TRUE,
  return_NA = FALSE,
  rare_thres = 0.05,
  scales = c("alpha", "gamma", "beta"),
  replace = FALSE,
  C_target_gamma = NA,
  ...
)
```

Arguments

abund_mat	Abundance based site-by-species table. Species as columns
index	The calculated biodiversity indices. The options are • N ... Number of individuals (total abundance) • S ... Number of species • S_n ... Rarefied or extrapolated number of species for n individuals • S_C ... Estimate species richness of a given level of coverage by C_target_gamma • S_asymp ... Estimated asymptotic species richness • f_0 ... Estimated number of undetected species • pct_rare ... The percent of rare species as defined by rare_thres • PIE ... Hurlbert's PIE (Probability of Interspecific Encounter) • S_PIE ... Effective number of species based on PIE See *Details* for additional information on the biodiversity statistics.
effort	The standardized number of individuals used for the calculation of rarefied species richness. This can a be single integer or a vector of integers.
extrapolate	Boolean which specifies if richness should be extrapolated when effort is larger than the number of individuals using the chao1 method.
return_NA	Boolean in which the rarefaction function returns the observed S when effort is larger than the number of individuals. If set to TRUE then NA is returned. Note that this argument is only relevant when extrapolate = FALSE.
rare_thres	The threshold that determines how pct_rare is computed. It can range from (0, 1] and defaults to 0.05 which specifies that any species with less than or equal to 5 considered rare. It can also be specified as "N/S" which results in using average abundance as the threshold which McGill (2011) found to have the best small sample behavior.
scales	The scales to compute the diversity indices for: • alpha ... for each row of the site x species community matrix • gamma ... for the entire site x species community matrix • beta ... the ratio of diversity at the gamma and alpha scales. Defaults to all three scales: c('alpha', 'gamma', 'beta')
replace	Used for PIE and SPIE. If TRUE, sampling with replacement is used. Otherwise, sampling without replacement (default).
C_target_gamma	When computing coverage based richness (S_C) then this argument can be used to specify the coverage to be used for the gamma scale richness estimate. This defaults to NA in which case the target cover is computed by calc_C_target (i.e., the largest allowable sample size).
...	additional arguments that can be passed to calc_div

Details

BIODIVERSITY INDICES

N: total community abundance is the total number of individuals observed across all species in the sample

S: species richness is the observed number of species that occurs at least once in a sample

S_n: Rarefied species richness is the expected number of species, given a defined number of sampled individuals (n) (Gotelli & Colwell 2001). Rarefied richness at the alpha-scale is calculated for the values provided in `effort_samples` as long as these values are not smaller than the user-defined minimum value `effort_min`. In this case the minimum value is used and samples with less individuals are discarded. When no values for `effort_samples` are provided the observed minimum number of individuals of the samples is used, which is the standard in rarefaction analysis (Gotelli & Colwell 2001). Because the number of individuals is expected to scale linearly with sample area or effort, at the gamma-scale the number of individuals for rarefaction is calculated as the minimum number of samples within groups multiplied by `effort_samples`. For example, when there are 10 samples within each group, `effort_groups` equals `10 * effort_samples`. If n is larger than the number of individuals in sample and `extrapolate = TRUE` then the Chao1 (Chao 1984, Chao 1987) method is used to extrapolate the rarefaction curve.

pct_rare: Percent of rare species Is the ratio of the number of rare species to the number of observed species x 100 (McGill 2011). Species are considered rare in a particular sample if they have fewer individuals than `rare_thres * N` where `rare_thres` can be set by the user and `N` is the total number of individuals in the sample. The default value of `rare_thres` of 0.05 is arbitrary and was chosen because McGill (2011) found this metric of rarity performed well and was generally less correlated with other common metrics of biodiversity. Essentially this metric attempt to estimate what proportion of the species in the same occur in the tail of the species abundance distribution and is therefore sensitive to presence of rare species.

S_asymp: Asymptotic species richness is the expected number of species given complete sampling and here it is calculated using the Chao1 estimator (Chao 1984, Chao 1987) see `calc_chao1`. Note: this metric is typically highly correlated with S (McGill 2011).

f_0: Undetected species richness is the number of undetected species or the number of species observed 0 times which is an indicator of the degree of rarity in the community. If there is a greater rarity then f_0 is expected to increase. This metric is calculated as `S_asymp - S`. This metric is less correlated with S than the raw `S_asymp` metric.

PIE: Probability of intraspecific encounter represents the probability that two randomly drawn individuals belong to the same species. Here we use the definition of Hurlbert (1971), which considers sampling without replacement. PIE is closely related to the well-known Simpson diversity index, but the latter assumes sampling with replacement.

S_PIE: Effective number of species for PIE represents the effective number of species derived from the PIE. It is calculated using the asymptotic estimator for Hill numbers of diversity order 2 (Chao et al, 2014). S_PIE represents the species richness of a hypothetical community with equally-abundant species and infinitely many individuals corresponding to the same value of PIE as the real community. An intuitive interpretation of S_PIE is that it corresponds to the number of dominant (highly abundant) species in the species pool.

For species richness `S`, rarefied richness `S_n`, undetected richness `f_0`, and the Effective Number of Species `S_PIE` we also calculate beta-diversity using multiplicative partitioning (Whittaker 1972, Jost 2007). That means for these indices we estimate beta-diversity as the ratio of gamma-diversity (total diversity across all plots) divided by alpha-diversity (i.e., average plot diversity).

Value

A `data.frame` with four columns:

- scale ... Group label for sites
- index ... Name of the biodiversity index
- sample_size ... The number of samples used to compute the statistic, helpful for interpreting beta and gamma metrics.
- effort ... Sampling effort for rarefied richness (NA for the other indices)
- gamma_coverage ... The coverage value for that particular effort value on the gamma scale rarefaction curve. Will be NA unless coverage based richness (S_C) and/or beta diversity is computed.
- value ... Value of the biodiversity index

Author(s)

Felix May and Dan McGlinn

References

McGill, B. J. 2011. Species abundance distributions. Pages 105-122 Biological Diversity: Frontiers in Measurement and Assessment, eds. A.E. Magurran and B.J. McGill.

Examples

```
data(tank_comm)
div_metrics <- calc_comm_div(tank_comm, 'S_n', effort = c(5, 10))
div_metrics
div_metrics <- calc_comm_div(tank_comm, 'S_C', C_target_gamma = 0.75)
div_metrics
```

---

calc_C_target *Calculate the recommended target coverage value for the computation of beta_C*

Description

Returns the estimated gamma-scale coverage that corresponds to the largest allowable sample size (i.e. the smallest observed sample size at the alpha scale multiplied by an extrapolation factor). The default (factor = 2) allows for extrapolation up to 2 times the observed sample size of the smallest alpha sample. For factor= 1, only interpolation is applied. Factors larger than 2 are not recommended.

Usage

```
calc_C_target(x, factor = 2)
```

Arguments

x	a site by species abundance matrix
factor	numeric. A multiplier for how much larger than total community abundance to extrapolate to. Defaults to 2.

Value

numeric value

Examples

```
data(tank_comm)

# What is the largest possible C that I can use to calculate beta_C
calc_C_target(tank_comm)
```

`calc_div` *Compute various diversity indices from a vector of species abundances (i.e., one row of a community matrix)*

Description

Compute various diversity indices from a vector of species abundances (i.e., one row of a community matrix)

Usage

```
calc_div(
  x,
  index,
  effort = NA,
  rare_thres = 0.05,
  replace = FALSE,
  C_target = NULL,
  extrapolate = TRUE,
  ...
)
```

Arguments

`x`	is a vector of species abundances
`index`	The calculated biodiversity indices. The options are • `N` ... Number of individuals (total abundance) • `S` ... Number of species • `S_n` ... Rarefied or extrapolated number of species for n individuals • `S_C` ... Estimate species richness of a given level of coverage by `C_target_gamma` • `S_asymp` ... Estimated asymptotic species richness • `f_0` ... Estimated number of undetected species • `pct_rare` ... The percent of rare species as defined by `rare_thres` • `PIE` ... Hurlbert's PIE (Probability of Interspecific Encounter) • `S_PIE` ... Effective number of species based on PIE

See *Details* for additional information on the biodiversity statistics.

`effort` The standardized number of individuals used for the calculation of rarefied species richness. This can a be single integer or a vector of integers.

`rare_thres` The threshold that determines how pct_rare is computed. It can range from (0, 1] and defaults to 0.05 which specifies that any species with less than or equal to 5 considered rare. It can also be specified as "N/S" which results in using average abundance as the threshold which McGill (2011) found to have the best small sample behavior.

`replace` Used for `PIE` and `SPIE`. If TRUE, sampling with replacement is used. Otherwise, sampling without replacement (default).

`C_target` When computing coverage based richness (`S_C`) then this argument can be used to specify the coverage to be used for the richness estimate. This defaults to `NA` in which case the target cover is computed by `calc_C_target` (i.e., the largest allowable sample size).

`extrapolate` Boolean which specifies if richness should be extrapolated when effort is larger than the number of individuals using the chao1 method.

`...` additional arguments that can be passed to the function `rarefaction` when computing `S_n`.

Examples

```
data(inv_tank)
calc_div(tank_comm[1, ], 'S_n', effort = c(5, 10))
calc_div(tank_comm[1, ], 'S_C', C_target = 0.9)
```

---

calc_PIE *Calculate probability of interspecific encounter (PIE)*

Description

`calc_PIE` returns the probability of interspecific encounter (PIE) which is also known as Simpson's evenness index and Gini-Simpson index.

Usage

```
calc_PIE(x, replace = FALSE)
```

Arguments

`x` can either be a: 1) mob_in object, 2) community matrix-like object in which rows represent plots and columns represent species, or 3) a vector which contains the abundance of each species.

`replace` if TRUE, sampling with replacement is used. Otherwise, sampling without replacement (default).

Details

By default, Hurlbert's (1971) sample-size corrected formula is used:

$PIE = N/(N-1) * (1 - sum(p_i^2))$

where N is the total number of individuals and p_i is the relative abundance of species i. This formulation uses sampling without replacement (`replace = F`) For sampling with replacement (i.e., the sample-size uncorrected version), set `replace = T`.

In earlier versions of `mobr`, there was an additional argument (`ENS`) for the conversion into an effective number of species (i.e S_PIE). Now, `calc_SPIE` has become its own function and the (`ENS`) argument is no longer supported . Please, use `calc_SPIE` instead.

Value

either a single PIE value or vector of PIE values.

Author(s)

Dan McGlinn, Thore Engel

References

Hurlbert, S. H. (1971) The nonconcept of species diversity: a critique and alternative parameters. Ecology 52, 577-586.

See Also

`calc_SPIE`

Examples

```
data(inv_comm)
calc_PIE(inv_comm)
calc_PIE(inv_comm, replace = TRUE)
calc_PIE(c(23,21,12,5,1,2,3))
calc_PIE(c(23,21,12,5,1,2,3), replace = TRUE)
```

`calc_SPIE` *Calculate S_PIE*

Description

S_PIE is the effective number of species transformation of the probability of interspecific encounter (PIE) which is equal to the number of equally common species that result in that value of PIE.

Usage

```
calc_SPIE(x, replace = F)
```

Arguments

x	can either be a: 1) mob_in object, 2) community matrix-like object in which rows represent plots and columns represent species, or 3) a vector which contains the abundance of each species.
replace	if TRUE, sampling with replacement is used. Otherwise, sampling without replacement (default).

Details

By default the sample size corrected version is returned (`replace = F`), which is the asymptotic estimator for the Hill number of diversity order q=2 (Chao et al, 2014). If `replace = T` the uncorrected hill number is returned. This is the same as vegan::diversity(x, index="invsimpson").

Value

either a single S_PIE value or vector of S_PIE values.

References

Chao, A., Gotelli, N. J., Hsieh, T. C., Sander, E. L., Ma, K. H., Colwell, R. K., & Ellison, A. M. (2014). Rarefaction and extrapolation with Hill numbers: A framework for sampling and estimation in species diversity studies. Ecological Monographs 84(1), 45-67.

See Also

calc_PIE

Examples

```
data(inv_comm)
calc_SPIE(inv_comm)
calc_SPIE(inv_comm, replace = TRUE)
calc_SPIE(c(23,21,12,5,1,2,3), replace=TRUE)
```

---

calc_S_C *Calculate species richness for a given coverage level.*

Description

This function uses coverage-based rarefaction to compute species richness. Specifically, the metric is computed as the

Usage

```
calc_S_C(x, C_target = NULL, extrapolate = TRUE, interrupt = TRUE)
```

Arguments

x	a site by species matrix or a species abundance distribution
C_target	target coverage between 0 and 1 (default is NULL). If not provided then target coverage is computed by calc_C_target
extrapolate	logical. Defaults to TRUE in which case richness is extrapolated to sample sizes larger than observed in the dataset.
interrupt	logical. Should the function throw an error when C_target exceeds the maximum recommendable coverage?

Value

numeric value which is the species richness at a specific level of coverage.

References

Chao, A., and L. Jost. 2012. Coverage-based rarefaction and extrapolation: standardizing samples by completeness rather than size. Ecology 93:2533–2547.

Anne Chao, Nicholas J. Gotelli, T. C. Hsieh, Elizabeth L. Sander, K. H. Ma, Robert K. Colwell, and Aaron M. Ellison 2014. Rarefaction and extrapolation with Hill numbers: a framework for sampling and estimation in species diversity studies. Ecological Monographs 84:45-67.

T. C. Hsieh, K. H. Ma and Anne Chao. 2024. iNEXT: iNterpolation and EXTrapolation for species diversity. R package version 3.0.1 URL: http://chao.stat.nthu.edu.tw/wordpress/software-download/.

See Also

invChat

Examples

```
data(tank_comm)
# What is species richness for a coverage value of 60%?
calc_S_C(tank_comm, C_target = 0.6)
```

Chat *Calculate expected sample coverage C_hat*

Description

Returns expected sample coverage of a sample ‘x‘ for a smaller than observed sample size ‘m‘ (Chao & Jost, 2012). This code was copied from INEXT’s internal function iNEXT::Chat.Ind (Hsieh et al 2016).

Usage

```
Chat(x, m)
```

Arguments

x	integer vector (species abundances)
m	integer a number of individuals that is smaller than observed total community abundance.

Value

a numeric value that is the expected coverage.

References

Chao, A., and L. Jost. 2012. Coverage-based rarefaction and extrapolation: standardizing samples by completeness rather than size. Ecology 93:2533–2547.

Anne Chao, Nicholas J. Gotelli, T. C. Hsieh, Elizabeth L. Sander, K. H. Ma, Robert K. Colwell, and Aaron M. Ellison 2014. Rarefaction and extrapolation with Hill numbers: a framework for sampling and estimation in species diversity studies. Ecological Monographs 84:45-67.

T. C. Hsieh, K. H. Ma and Anne Chao. 2024. iNEXT: iNterpolation and EXTrapolation for species diversity. R package version 3.0.1 URL: http://chao.stat.nthu.edu.tw/wordpress/software-download/.

Examples

```
data(inv_comm)
# What is the expected coverage at a sample size of 50 at the gamma scale?
Chat(colSums(inv_comm), 50)
```

---

compare_samp_rarefaction

Compare all sample-based curves (random, spatially constrained-k-NN, spatially constrained-k-NCN)

Description

This is just plotting all curves.

Usage

```
compare_samp_rarefaction(x)
```

Arguments

x	a mob_in object

Value

a plot

Examples

```
data(inv_comm)
data(inv_plot_attr)
inv_mob_in = make_mob_in(inv_comm, inv_plot_attr, coord_names = c('x', 'y'))
compare_samp_rarefaction(inv_mob_in)
```

`fire_comm` *Fire data set*

Description

Woody plant species counts in burned and unburned forest sites in the Missouri Ozarks, USA.

Details

`fire_comm` is a site-by-species matrix with individual counts.

`fire_plot_attr` is a data frame with corresponding site variables. The column `group` specifies whether a site is "burned" or "unburned". This variable is considered a "treatment" in the mob framework. The columns `x` and `y` contain the spatial coordinates of the sites.

The data were adapted from Myers et al (2015).

References

Myers, J. A., Chase, J. M., Crandall, R. M., & Jimenez, I. (2015). Disturbance alters beta-diversity but not the relative importance of community assembly mechanisms. Journal of Ecology, 103: 1291-1299.

Examples

```
data(fire_comm)
data(fire_plot_attr)
fire_mob_in = make_mob_in(fire_comm, fire_plot_attr)
```

`get_delta_stats` *Conduct the MoB tests on drivers of biodiversity across scales.*

Description

There are three tests, on effects of 1. the shape of the SAD, 2. treatment/group-level density, 3. degree of aggregation. The user can specifically to conduct one or more of these tests.

Usage

```
get_delta_stats(
  mob_in,
  env_var,
  group_var = NULL,
  ref_level = NULL,
  tests = c("SAD", "N", "agg"),
  spat_algo = NULL,
  type = c("continuous", "discrete"),
  stats = NULL,
  inds = NULL,
  log_scale = FALSE,
  min_plots = NULL,
  density_stat = c("mean", "max", "min"),
  n_perm = 1000,
  overall_p = FALSE
)
```

Arguments

mob_in	an object of class mob_in created by make_mob_in()
env_var	a character string specifying the environmental variable in mob_in$env to be used for explaining the change in richness
group_var	an optional character string in mob_in$env which defines how samples are pooled. If not provided then each unique value of the argument env_var is used define the groups.
ref_level	a character string used to define the reference level of env_var to which all other groups are compared with. Only makes sense if env_var is a factor (i.e. type == 'discrete')
tests	specifies which one or more of the three tests ('SAD', N', 'agg') are to be performed. Default is to include all three tests.
spat_algo	character string that can be either: 'kNN' or 'kNCN' for k-nearest neighbor and k-nearest centroid neighbor sampling respectively. It defaults to k-nearest neighbor which is a more computationally efficient algorithm that closely approximates the potentially more correct k-NCN algo (see Details of ?rarefaction).
type	"discrete" or "continuous". If "discrete", pair-wise comparisons are conducted between all other groups and the reference group. If "continuous", a correlation analysis is conducted between the response variables and env_var.
stats	a vector of character strings that specifies what statistics to summarize effect sizes with. Options include: c('betas', 'r2','r2adj', 'f', 'p') for the beta-coefficients, r-squared, adjusted r-squared, F-statistic, and p-value respectively. The default value of NULL will result in only betas being calculated when type == 'discrete' and all possible stats being computed when type == 'continuous'. Note that for a discrete analysis all non-betas stats are meaningless because the model has zero degrees of freedom in this context.

`inds` effort size at which the individual-based rarefaction curves are to be evaluated, and to which the sample-based rarefaction curves are to be interpolated. It can take three types of values, a single integer, a vector of integers, and NULL. If `inds = NULL` (the default), the curves are evaluated at every possible effort size, from 1 to the total number of individuals within the group (slow). If inds is a single integer, it is taken as the number of points at which the curves are evaluated; the positions of the points are determined by the "log_scale" argument. If inds is a vector of integers, it is taken as the exact points at which the curves are evaluated.

`log_scale` if "inds" is given a single integer, "log_scale" determines the position of the points. If log_scale is TRUE, the points are equally spaced on logarithmic scale. If it is FALSE (default), the points are equally spaced on arithmetic scale.

`min_plots` minimal number of plots for test 'agg', where plots are randomized within groups as null test. If it is given a value, all groups with fewer plots than min_plot are removed for this test. If it is NULL (default), all groups are kept. Warnings are issued if 1. there is only one group left and "type" is discrete, or 2. there are less than three groups left and "type" is continuous, or 3. reference group ("ref_group") is removed and "type" is discrete. In these three scenarios, the function will terminate. A different warning is issued if any of the remaining groups have less than five plots (which have less than 120 permutations), but the test will be carried out.

`density_stat` reference density used in converting number of plots to numbers of individuals, a step in test "N". It can take one of the three values: "mean", "max", or "min". If it is "mean", the average plot-level abundance across plots (all plots when "type" is "continuous, all plots within the two groups for each pair-wise comparison when "type" is "discrete") are used. If it is "min" or "max", the minimum/maximum plot-level density is used.

`n_perm` number of iterations to run for null tests, defaults to 1000.

`overall_p` Boolean defaults to FALSE specifies if overall across scale p-values for the null tests. This should be interpreted with caution because the overall p-values depend on scales of measurement yet do not explicitly reflect significance at any particular scale.

Value

a "mob_out" object with attributes

Author(s)

Dan McGlinn and Xiao Xiao

See Also

`rarefaction`

Examples

```
data(inv_comm)
data(inv_plot_attr)
inv_mob_in = make_mob_in(inv_comm, inv_plot_attr, coord_names = c('x', 'y'))
inv_mob_out = get_delta_stats(inv_mob_in, 'group', ref_level='uninvaded',
                          type='discrete', log_scale=TRUE, n_perm=3)
plot(inv_mob_out)
```

`get_mob_stats` *A now obsolete function that used to calculate sample based and group based biodiversity statistics.*

Description

A now obsolete function that used to calculate sample based and group based biodiversity statistics.

Usage

```
get_mob_stats(
  mob_in,
  group_var,
  ref_level = NULL,
  index = c("N", "S", "S_n", "S_PIE"),
  effort_samples = NULL,
  effort_min = 5,
  extrapolate = TRUE,
  return_NA = FALSE,
  rare_thres = 0.05,
  n_perm = 0,
  boot_groups = FALSE,
  conf_level = 0.95,
  cl = NULL,
  ...
)
```

Arguments

`mob_in`	an object of class mob_in created by make_mob_in()
`group_var`	String that specifies which field in `mob_in$env` the data should be grouped by
`ref_level`	String that defines the reference level of `group_var` to which all other groups are compared with, defaults to `NULL`. If `NULL` then the default contrasts of `group_var` are used.
`index`	The calculated biodiversity indices. The options are • `N` ... Number of individuals (total abundance) • `S` ... Number of species

- S_n ... Rarefied or extrapolated number of species for n individuals
- S_asymp ... Estimated asymptotic species richness
- f_0 ... Estimated number of undetected species
- pct_rare ... The percent of rare species as defined by rare_thres
- PIE ... Hurlbert's PIE (Probability of Interspecific Encounter)
- S_PIE ... Effective number of species based on PIE

If index is not specified then N, S, S_n, pct_rare, and S_PIE are computed by default. See *Details* for additional information on the biodiversity statistics.

`effort_samples` The standardized number of individuals used for the calculation of rarefied species richness at the alpha-scale. This can a be single value or an integer vector. As default the minimum number of individuals found across the samples is used, when this is not smaller than `effort_min`.

`effort_min` The minimum number of individuals considered for the calculation of rarefied richness (Default value of 5). Samples with less individuals then `effort_min` are excluded from the analysis with a warning. Accordingly, when `effort_samples` is set by the user it has to be higher than `effort_min`.

`extrapolate` Boolean which specifies if richness should be extrapolated when `effort_samples` is larger than the number of individuals using the chao1 method. Defaults to TRUE.

`return_NA` Boolean defaults to FALSE in which the rarefaction function returns the observed S when `effort` is larger than the number of individuals. If set to TRUE then NA is returned. Note that this argument is only relevant when `extrapolate = FALSE`.

`rare_thres` The threshold that determines how pct_rare is computed. It can range from (0, 1] and defaults to 0.05 which specifies that any species with less than or equal to 5 considered rare. It can also be specified as "N/S" which results in using average abundance as the threshold which McGill (2011) found to have the best small sample behavior.

`n_perm` The number of permutations to use for testing for treatment effects. Defaults to 0 (i.e., no permutations)

`boot_groups` Use bootstrap resampling within groups to derive gamma-scale confidence intervals for all biodiversity indices. Default is `FALSE`. See *Details* for information on the bootstrap approach.

`conf_level` Confidence level used for the calculation of gamma-scale bootstrapped confidence intervals. Only used when `boot_groups = TRUE`.

`cl` A cluster object created by `makeCluster`, or an integer to indicate number of child-processes (integer values are ignored on Windows) for parallel evaluations (see Details on performance). It can also be `"future"` to use a future backend (see Details), `NULL` (default) refers to sequential evaluation.

`...` Optional arguments to `FUN` and also to underlying functions (e.g. `parLapply` and `mclapply` when `cl` is not `NULL`).

Details

BIODIVERSITY INDICES

S_n: Rarefied species richness is the expected number of species, given a defined number of sampled individuals (n) (Gotelli & Colwell 2001). Rarefied richness at the alpha-scale is calculated for the values provided in `effort_samples` as long as these values are not smaller than the user-defined minimum value `effort_min`. In this case the minimum value is used and samples with less individuals are discarded. When no values for `effort_samples` are provided the observed minimum number of individuals of the samples is used, which is the standard in rarefaction analysis (Gotelli & Colwell 2001). Because the number of individuals is expected to scale linearly with sample area or effort, at the gamma-scale the number of individuals for rarefaction is calculated as the minimum number of samples within groups multiplied by `effort_samples`. For example, when there are 10 samples within each group, `effort_groups` equals `10 * effort_samples`. If n is larger than the number of individuals in sample and `extrapolate = TRUE` then the Chao1 (Chao 1984, Chao 1987) method is used to extrapolate the rarefaction curve.

pct_rare: Percent of rare species Is the ratio of the number of rare species to the number of observed species x 100 (McGill 2011). Species are considered rare in a particular sample if they have fewer individuals than `rare_thres * N` where `rare_thres` can be set by the user and `N` is the total number of individuals in the sample. The default value of `rare_thres` of 0.05 is arbitrary and was chosen because McGill (2011) found this metric of rarity performed well and was generally less correlated with other common metrics of biodiversity. Essentially this metric attempt to estimate what proportion of the species in the same occur in the tail of the species abundance distribution and is therefore sensitive to presence of rare species.

S_asymp: Asymptotic species richness is the expected number of species given complete sampling and here it is calculated using the Chao1 estimator (Chao 1984, Chao 1987) see `calc_chao1`. Note: this metric is typically highly correlated with S (McGill 2011).

f_0: Undetected species richness is the number of undetected species or the number of species observed 0 times which is an indicator of the degree of rarity in the community. If there is a greater rarity then f_0 is expected to increase. This metric is calculated as `S_asymp - S`. This metric is less correlated with S than the raw `S_asymp` metric.

PIE: Probability of intraspecific encounter represents the probability that two randomly drawn individuals belong to the same species. Here we use the definition of Hurlbert (1971), which considers sampling without replacement. PIE is closely related to the well-known Simpson diversity index, but the latter assumes sampling with replacement.

S_PIE: Effective number of species for PIE represents the effective number of species derived from the PIE. It is calculated using the asymptotic estimator for Hill numbers of diversity order 2 (Chao et al, 2014). S_PIE represents the species richness of a hypothetical community with equally-abundant species and infinitely many individuals corresponding to the same value of PIE as the real community. An intuitive interpretation of S_PIE is that it corresponds to the number of dominant (highly abundant) species in the species pool.

For species richness `S`, rarefied richness `S_n`, undetected richness `f_0`, and the Effective Number of Species `S_PIE` we also calculate beta-diversity using multiplicative partitioning (Whittaker 1972, Jost 2007). That means for these indices we estimate beta-diversity as the ratio of gamma-diversity (total diversity across all plots) divided by alpha-diversity (i.e., average plot diversity).

PERMUTATION TESTS AND BOOTSTRAP

For both the alpha and gamma scale analyses we summarize effect size in each biodiversity index by computing `D_bar`: the average absolute difference between the groups. At the alpha scale the indices are averaged first before computing `D_bar`.

We used permutation tests for testing differences of the biodiversity statistics among the groups (Legendre & Legendre 1998). At the alpha-scale, one-way ANOVA (i.e. F-test) is implemented by shuffling treatment group labels across samples. The test statistic for this test is the F-statistic which is a pivotal statistic (Legendre & Legendre 1998). At the gamma-scale we carried out the permutation test by shuffling the treatment group labels and using `D_bar` as the test statistic. We could not use the F-statistic as the test statistic at the gamma scale because at this scale there are no replicates and therefore the F-statistic is undefined.

A bootstrap approach can be used to also test differences at the gamma-scale. When `boot_groups = TRUE` instead of the gamma-scale permutation test, there will be resampling of samples within groups to derive gamma-scale confidence intervals for all biodiversity indices. The function output includes lower and upper confidence bounds and the median of the bootstrap samples. Please note that for the richness indices sampling with replacement corresponds to rarefaction to ca. 2/3 of the individuals, because the same samples occur several times in the resampled data sets.

Value

A list of class `mob_stats` that contains alpha-scale and gamma-scale biodiversity statistics, as well as the p-values for permutation tests at both scales.

When `boot_groups = TRUE` there are no p-values at the gamma-scale. Instead there is lower bound, median, and upper bound for each biodiversity index derived from the bootstrap within groups.

Author(s)

Felix May and Dan McGlinn

References

Chiu, C.-H., Wang, Y.-T., Walther, B.A. & Chao, A. (2014) An improved nonparametric lower bound of species richness via a modified good-turing frequency formula. Biometrics, 70, 671-682.

Gotelli, N.J. & Colwell, R.K. (2001) Quantifying biodiversity: procedures and pitfalls in the measurement and comparison of species richness. Ecology letters, 4, 379-391.

Hurlbert, S.H. (1971) The Nonconcept of Species Diversity: A Critique and Alternative Parameters. Ecology, 52, 577-586.

Jost, L. (2006) Entropy and diversity. Oikos, 113, 363-375.

Jost, L. (2007) Partitioning Diversity into Independent Alpha and Beta Components. Ecology, 88, 2427-2439.

Legendre, P. & Legendre, L.F.J. (1998) Numerical Ecology, Volume 24, 2nd Edition Elsevier, Amsterdam; Boston.

McGill, B.J. (2011) Species abundance distributions. 105-122 in Biological Diversity: Frontiers in Measurement and Assessment. eds. A.E. Magurran B.J. McGill.

Whittaker, R.H. (1972) Evolution and Measurement of Species Diversity. Taxon, 21, 213-251.

`get_null_comm` *Generate a null community matrix*

Description

Three null models are implemented that randomize different components of community structure while keeping other components constant.

Usage

```
get_null_comm(comm, null_model, groups = NULL)
```

Arguments

`comm`	community matrix of abundances with plots as rows and species columns.
`null_model`	a string which specifies which null model to use options include: `'rand_SAD'`, `'rand_N'`, and `'rand_agg'`. See Details for description of each null model.
`groups`	optional argument that is a vector of group ids which specify which group each site is associated with. If is `NULL` then all rows of the community matrix are assumed to be members of the same group

Details

This function implements three different nested null models. They are considered nested because at the core of each null model is the random sampling with replacement of the relative abundance distribution (RAD) to generate a random sample of a species abundance distribution (SAD). Here we describe each null model:

- `'rand_SAD'` ... A random SAD is generated using a sample with replacement of individuals from the species pool proportional to their observed relative abundance. This null model will produce an SAD that is of a similar functional form to the observed SAD (Green and Plotkin 2007). The total abundance of the random SAD is the same as the observed SAD but overall species richness will be equal to or less than the observed SAD. This algorithm ignores the `group` argument. This sampling algorithm is also used in the two other null models `'rand_N'` and `'rand_agg'`.
- `'rand_N'` ... The total number of individuals in a plot is shuffled across all plots (within and between groups). Then for each plot that many individuals are drawn randomly from the group specific relative abundance distribution with replacement for each plot (i.e., using the `'rand_SAD'` algorithm described above. This removes group differences in the total number of individuals in a given plot, but maintains group level differences in their SADs.
- `'rand_agg'` ... This null model nullifies the spatial structure of individuals (i.e., their aggregation), but it is constrained by the observed total number of individuals in each plot (in contrast to the `'rand_N'` null model), and the group specific SAD (in contrast to the `'rand_SAD'` null model). The other two null models also nullify spatial structure. The `'rand_agg'` null model is identical to the `'rand_N'` null model except that plot abundances are not shuffled.

Replaces depreciated function ‘permute_comm‘

Value

a site-by-species matrix

References

Green, J. L., and J. B. Plotkin. 2007. A statistical theory for sampling species abundances. Ecology Letters 10:1037-1045.

Examples

```
S = 3
N = 20
nplots = 4
comm = matrix(rpois(S * nplots, 1), ncol = S, nrow = nplots)
comm
groups = rep(1:2, each=2)
groups
set.seed(1)
get_null_comm(comm, 'rand_SAD')
# null model 'rand_SAD' ignores groups argument
set.seed(1)
get_null_comm(comm, 'rand_SAD', groups)
set.seed(1)
get_null_comm(comm, 'rand_N')
# null model 'rand_N' does not ignore the groups argument
set.seed(1)
get_null_comm(comm, 'rand_N', groups)
# note that the 'rand_agg' null model is constrained by observed plot abundances
noagg = get_null_comm(comm, 'rand_agg', groups)
noagg
rowSums(comm)
rowSums(noagg)
```

---

invChat *Number of individuals corresponding to a desired coverage (inverse C_hat)*

Description

If you wanted to resample a vector to a certain expected sample coverage, how many individuals would you have to draw? This is C_hat solved for the number of individuals. This code is a modification of INEXT's internal function 'invChat.Ind' (Hsieh et al 2016).

Usage

```
invChat(x, C)
```

Arguments

x	integer vector (species abundances)
C	coverage value between 0 and 1

Value

a numeric value which is the number of individuals for a given level of coverage C.

References

Chao, A., and L. Jost. 2012. Coverage-based rarefaction and extrapolation: standardizing samples by completeness rather than size. Ecology 93:2533–2547.

Anne Chao, Nicholas J. Gotelli, T. C. Hsieh, Elizabeth L. Sander, K. H. Ma, Robert K. Colwell, and Aaron M. Ellison 2014. Rarefaction and extrapolation with Hill numbers: a framework for sampling and estimation in species diversity studies. Ecological Monographs 84:45-67.

T. C. Hsieh, K. H. Ma and Anne Chao. 2024. iNEXT: iNterpolation and EXTrapolation for species diversity. R package version 3.0.1 URL: http://chao.stat.nthu.edu.tw/wordpress/software-download/.

See Also

calc_S_C

Examples

```
data(inv_comm)
# What sample size corresponds to an expected sample coverage of 55%?
invChat(colSums(inv_comm), 0.55)
```

---

inv_comm *Invasive plants dataset*

Description

Herbaceous plant species counts sites invaded and uninvaded by *Lonicera maackii* (Amur honeysuckle) which is an invasive shrub.

Details

inv_comm is a site-by-species matrix with individual counts.

inv_plot_attr is a data frame with corresponding site variables. The column group specifies whether a site is "invaded" or "uninvaded". This variable is considered a "treatment" in the mob framework. The columns x and y contain the spatial coordinates of the sites.

The data were adapted from Powell et al (2013).

References

Powell, K. I., Chase, J. M., & Knight, T. M. (2013). Invasive plants have scale-dependent effects on diversity by altering species-area relationships. Science, 339: 316-318.

Examples

```
data(inv_comm)
data(inv_plot_attr)
inv_mob_in = make_mob_in(inv_comm, inv_plot_attr)
```

`kNCN_average` *Construct spatially constrained sample-based rarefaction (sSBR) curve using the k-Nearest-Centroid-neighbor (k-NCN) algorithm*

Description

This function accumulates samples according their proximity to all previously included samples (their centroid) as opposed to the proximity to the initial focal sample. This ensures that included samples mutually close to each other and not all over the place.

Usage

```
kNCN_average(
  x,
  n = NULL,
  coords = NULL,
  repetitions = 1,
  no_pb = TRUE,
  latlong = FALSE,
  cl = NULL
)
```

Arguments

`x`	a mob_in object or a community site x species matrix
`n`	number of sites to include.
`coords`	spatial coordinates of the samples. If x is a mob_in object, the function uses its 'spat' table as coordinates.
`repetitions`	Number of times to repeat the procedure. Useful in situations where there are many ties in the distance matrix.
`no_pb`	binary, if TRUE then a progress bar is not printed, defaults to TRUE
`latlong`	if longitude latitudes are supplied
`cl`	A cluster object created by `makeCluster`, or an integer to indicate number of child-processes (integer values are ignored on Windows) for parallel evaluations (see Details on performance). It can also be `"future"` to use a future backend (see Details), `NULL` (default) refers to sequential evaluation.

Details

Internally the function constructs one curve per sample whereby each sample serves as the initial sample repetition times. Finally, the average curve is returned.

Value

a numeric vector of estimated species richness

Examples

```
data(inv_comm)
data(inv_plot_attr)
inv_mob_in = make_mob_in(inv_comm, inv_plot_attr, coord_names = c('x', 'y'))
kNCN_average(inv_mob_in, n = 5)

# parallel evaluation using the parallel package
# run in parallel
library(parallel)
cl = makeCluster(2L)
clusterEvalQ(cl, library(mobr))
clusterExport(cl, 'inv_mob_in')
S_kNCN = kNCN_average(inv_mob_in, cl=cl)

stopCluster(cl)
```

---

make_mob_in *Create the 'mob_in' object.*

Description

The 'mob_in' object will be passed on for analyses of biodiversity across scales.

Usage

```
make_mob_in(
  comm,
  plot_attr,
  coord_names = NULL,
  binary = FALSE,
  latlong = FALSE
)
```

Arguments

comm	community matrix in which rows are samples (e.g., plots) and columns are species.

plot_attr	matrix which includes the environmental attributes and spatial coordinates of the plots. Environmental attributes are mandatory, while spatial coordinates are optional.
coord_names	character vector with the names of the columns of plot_attr that specify the coordinates of the samples. Defaults to NULL (no coordinates). When providing coordinate names, the order the names are provided matters when working with latitude-longitude coordinates (i.e., argument latlong = TRUE, and it is expected that the column specifying the x-coordinate or the longitude is provided first, y-coordinate or latitude provided second. To provide coordinate names use the following syntax: coord_names = c('longitude_col_name','latitude_col_name')
binary	Boolean, defaults to FALSE. Whether the plot by species matrix "comm" is in abundances or presence/absence.
latlong	Boolean, defaults to FALSE. Whether the coordinates are latitude-longitudes. If TRUE, distance calculations by downstream functions are based upon great circle distances rather than Euclidean distances. Note latitude-longitudes should be in decimal degree.

Value

a "mob_in" object with four attributes. "comm" is the plot by species matrix. "env" is the environmental attribute matrix, without the spatial coordinates. "spat" contains the spatial coordinates (1-D or 2-D). "tests" specifies whether each of the three tests in the biodiversity analyses is allowed by data.

Author(s)

Dan McGlinn and Xiao Xiao

Examples

```
data(inv_comm)
data(inv_plot_attr)
inv_mob_in = make_mob_in(inv_comm, inv_plot_attr, coord_names = c('x', 'y'))
```

---

mobr *Measurement of Biodiversity in R*

Description

The primary aim of this package is to provide ecologist's tools to examine changes in biodiversity across spatial scales. Additionally, the package provides a method to examine how a factor mediates species richness via its effects on different aspects of community structure: total abundance, species commonness, and spatial aggregation of conspecifics.

Author(s)

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See Also

Useful links:

- https://github.com/MoBiodiv/mobr
- Report bugs at https://github.com/MoBiodiv/mobr/issues

`plot.mob_out` *Plot the multiscale MoB analysis output generated by* `get_delta_stats`.

Description

Plot the multiscale MoB analysis output generated by `get_delta_stats`.

Usage

```
## S3 method for class 'mob_out'
plot(
  x,
  stat = "b1",
  log2 = "",
  scale_by = NULL,
  display = c("S ~ effort", "effect ~ grad", "stat ~ effort"),
  eff_sub_effort = TRUE,
  eff_log_base = 2,
  eff_disp_pts = TRUE,
  eff_disp_smooth = FALSE,
  ...
)
```

Arguments

x	a mob_out class object
stat	a character string that specifies what statistic should be used in the effect size plots. Options include: `c('b0', 'b1', 'r', 'r2','r2adj', 'f')` for the beta-coefficients, person correlation coefficient, r-squared, adjusted r-squared, and F-statistic respectively. If the explanatory variable is a factor then `'b1'` is the only reasonable option. The default is set to the regression slope `'b1'` because this appears to have the strongest statistical power.
log2	a character string specifying if the x- or y-axis should be rescale by log base 2. Only applies when `display == 'S ~ effort' | 'S ~ effort'`. Options include: `c('', 'x', 'y', 'xy')` for no rescaling, x-axis, y-axis, and both x and y-axes respectively. Default is set to no rescaling.
scale_by	a character string specifying if sampling effort should be rescaled. Options include: `NULL`, `'indiv'`, and `'plot'` for no rescaling, rescaling to number of individuals, and rescaling to number of plots respectively. The rescaling is carried out using `mob_out$density_stat`.
display	a string that specifies what graphical panels to display. Options include: • `S ~ expl` ... plot of S versus the explanatory variable • `S ~ effort` ... plot of S versus sampling effort (i.e., a rarefaction curve) • `effect ~ expl` ... plot of agg., N, and SAD effect size versus explanatory variable • `stat ~ effort` ... plot of summary statistic versus sampling effort Defaults to `'S ~ effort'`, `'effect ~ expl'`, and `'stat ~ effort'`.
eff_sub_effort	Boolean which determines if only a subset of efforts will be considered in the plot of effect size (i.e., when `display = 'effect ~ expl'`. Defaults to TRUE to declutter the plots.
eff_log_base	a positive real number that determines the base of the logarithm that efforts were be distributed across, the larger this number the fewer efforts will be displayed.
eff_disp_pts	Boolean to display the raw effect points, defaults to TRUE
eff_disp_smooth	Boolean to display the regressions used to summarize the linear effect of the explanatory variable on the effect sizes, defaults to FALSE
...	parameters passed to other functions

Value

plots the effect of the SAD, the number of individuals, and spatial aggregation on the difference in species richness

Author(s)

Dan McGlinn and Xiao Xiao

Examples

```
data(inv_comm)
data(inv_plot_attr)
inv_mob_in = make_mob_in(inv_comm, inv_plot_attr, coord_names = c('x', 'y'))
inv_mob_out = get_delta_stats(inv_mob_in, 'group', ref_level='uninvaded',
                              type='discrete', log_scale=TRUE, n_perm=4)
plot(inv_mob_out, 'b1')

plot(inv_mob_out, 'b1', scale_by = 'indiv')
```

`plot.mob_stats` *Obsolete function that used to plot alpha- and gamma-scale biodiversity statistics for a MoB analysis*

Description

Plots a `mob_stats` object which is produced by the function `get_mob_stats`. The p-value for each statistic is displayed in the plot title if applicable.

Usage

```
## S3 method for class 'mob_stats'
plot(
  x,
  index = NULL,
  multi_panel = FALSE,
 col = c("#FFB3B5", "#78D3EC", "#6BDABD", "#C5C0FE", "#E2C288", "#F7B0E6", "#AAD28C"),
  cex.axis = 1.2,
  ...
)
```

Arguments

`x`	a `mob_stats` object that has the samples and treatment level statistics
`index`	The biodiversity statistics that should be plotted. See `get_mob_stats` for information on the indices. By default there is one figure for each index, with panels for alpha- and gamma-scale results as well as for beta-diversity when applicable.
`multi_panel`	A logical variable. If `multi_panel = TRUE` then a multipanel plot is produced, which shows observed, rarefied, and asymptotic species richness and S_PIE at the alpha- and gamma-scale. This set of variables conveys a comprehensive picture of the underlying biodiversity changes.
`col`	a vector of colors for the groups, set to NA if no color is preferred
`cex.axis`	The magnification to be used for axis annotation relative to the current setting of cex. Defaults to 1.2.
`...`	additional arguments to provide to `boxplot`, `points`, and confidence interval functions

Details

The user may specify which results to plot or simply to plot all the results.

Author(s)

Felix May, Xiao Xiao, and Dan McGlinn

`plot_abu` *Plot distributions of species abundance*

Description

Plot distributions of species abundance

Usage

```
plot_abu(
  mob_in,
  group_var,
  ref_level = NULL,
  type = c("sad", "rad"),
  scale = "gamma",
  col = NULL,
  lwd = 3,
  log = "",
  leg_loc = "topleft"
)
```

Arguments

`mob_in`	a 'mob_in' class object produced by 'make_mob_in'
`group_var`	String that specifies which field in `mob_in$env` the data should be grouped by
`ref_level`	String that defines the reference level of `group_var` to which all other groups are compared with, defaults to `NULL`. If `NULL` then the default contrasts of `group_var` are used.
`type`	either 'sad' or 'rad' for species abundance vs rank abundance distribution
`scale`	character string either 'alpha' for sample scale or 'gamma' for group scale. Defaults to 'gamma'.
`col`	optional vector of colors.
`lwd`	a number which specifies the width of the lines
`log`	a string that specifies if any axes are to be log transformed, options include 'x', 'y' or 'xy' in which either the x-axis, y-axis, or both axes are log transformed respectively
`leg_loc`	a string that specifies the location of the legend, options include: 'lowerleft', 'topleft', 'loweright','topright'

Examples

```
data(inv_comm)
data(inv_plot_attr)
inv_mob_in <- make_mob_in(inv_comm, inv_plot_attr, coord_names = c('x', 'y'))
plot_abu(inv_mob_in, 'group', 'uninvaded', type='sad', log='x')
plot_abu(inv_mob_in, 'group', 'uninvaded', type='rad', scale = 'alpha', log='x')
```

`plot_comm_div` *Plot alpha-, beta-, and gamma-scale biodiversity statistics for a MoB analysis*

Description

Plots the community diversity metrics from produced by the function `calc_comm_div`. The p-value for each statistic is displayed in the plot title if applicable.

Usage

```
plot_comm_div(
  comm_div,
  index = NULL,
  multi_panel = FALSE,
 col = c("#FFB3B5", "#78D3EC", "#6BDABD", "#C5C0FE", "#E2C288", "#F7B0E6", "#AAD28C"),
  cex.axis = 1.2,
  ...
)
```

Arguments

`comm_div`	a table that is output by `calc_comm_div` that has the sample (alpha) and group (gamma) level statistics
`index`	The biodiversity statistics that should be plotted. See `calc_comm_div` for information on the indices. By default there is one figure for each index, with panels for alpha- and gamma-scale results as well as for beta-diversity when applicable.
`multi_panel`	A logical variable. If `multi_panel = TRUE` then a multipanel plot is produced, which shows observed, rarefied, and asymptotic species richness and S_PIE at the alpha- and gamma-scale. This set of variables conveys a comprehensive picture of the underlying biodiversity changes.
`col`	a vector of colors for the groups, set to NA if no color is preferred
`cex.axis`	The magnification to be used for axis annotation relative to the current setting of cex. Defaults to 1.2.
`...`	additional arguments to provide to `boxplot`, `points`, and confidence interval functions

Details

The user may specify which results to plot or simply to plot all the results.

Author(s)

Felix May, Xiao Xiao, and Dan McGlinn

Examples

```
library(dplyr)
data(tank_comm)
data(tank_plot_attr)
indices <- c('N', 'S', 'S_C', 'S_n', 'S_PIE')
tank_div <- tibble(tank_comm) %>%
  group_by(group = tank_plot_attr$group) %>%
  group_modify(~ calc_comm_div(.x, index = indices, effort = 5,
                               extrapolate = TRUE))
# plot the community metrics
plot_comm_div(tank_div, index = "S")
plot_comm_div(tank_div, index = "S_n")
# or plot all of the indices at once with
plot_comm_div(tank_div)
```

---

plot_N *Plot the relationship between the number of plots and the number of individuals*

Description

The MoB methods assume a linear relationship between the number of plots and the number of individuals. This function provides a means of verifying the validity of this assumption

Usage

```
plot_N(comm, n_perm = 1000)
```

Arguments

comm	community matrix with sites as rows and species as columns
n_perm	number of permutations to average across, defaults to 1000

Author(s)

Dan McGlinn

Examples

```
data(inv_comm)
plot_N(inv_comm)
```

plot_rarefaction *Plot rarefaction curves for each treatment group*

Description

Plot rarefaction curves for each treatment group

Usage

```
plot_rarefaction(
  mob_in,
  group_var,
  ref_level = NULL,
  method,
  spat_algo = NULL,
  dens_ratio = 1,
  scales = c("alpha", "gamma", "study"),
  raw = TRUE,
  smooth = FALSE,
  avg = FALSE,
  col = NULL,
  lwd = 3,
  log = "",
  leg_loc = "topleft",
  one_panel = FALSE,
  ...
)
```

Arguments

mob_in	a 'mob_in' class object produced by 'make_mob_in'
group_var	String that specifies which field in mob_in$env the data should be grouped by
ref_level	String that defines the reference level of group_var to which all other groups are compared with, defaults to NULL. If NULL then the default contrasts of group_var are used.
method	a character string that specifies the method of rarefaction curve construction it can be one of the following: • 'IBR' ... individual-based rarefaction in which species are accumulated by randomly sampling individuals • 'SBR' ... sample-based rarefaction in which species are accumulated by randomly sampling samples (i.e., plots). Note that within plot spatial aggregation is maintained with this approach. Although this curve is implemented here, it is not used in the current version of the MoB framework • 'nsSBR' ... non-spatial, sampled-based rarefaction in which species are accumulated by randomly sampling samples that represent a spatially random sample of individuals (i.e., no with-in plot spatial aggregation). The

argument dens_ratio must also be set otherwise this sampling results in a curve identical to the IBR (see Details).

- 'sSBR' ... spatial sample-based rarefaction in which species are accumulated by including spatially proximate samples first.
- 'spexSBR' ... spatially-explicit sample-based rarefaction in which species are accumulated as in 'sSBR' but sampling effort is not measured by no. of samples, but by cumulative distance or cumulative area as specified by 'spat_algo' (see details)

spat_algo — character string that can be either: 'kNN', 'kNCN', or 'convexhull' for k-nearest neighbor, k-nearest centroid neighbor sampling, or convex-hull polygon calculation respectively. It defaults to k-nearest neighbor which is a more computationally efficient algorithm that closely approximates the potentially more correct k-NCN algo (see Details). Currently, 'kNN' and 'k-NCN' are available for method 'ssBR', while 'kNN' 'convexhull' are available for method 'spexSBR'.

dens_ratio — the ratio of individual density between a reference group and the community data (i.e., x) under consideration. This argument is used to rescale the rarefaction curve when estimating the effect of individual density on group differences in richness.

scales — character string which defaults to c('alpha', 'gamma', 'study') indicating that rarefaction curves at the alpha (i.e., single plot), gamma (i.e., group of plots), and study (i.e., all plots) scales should be computed and plotted.

raw — boolean. Defaults to TRUE so that raw rarefaction curves without averaging or smoothing are plotted

smooth — boolean. Defaults to FALSE. If set to TRUE a lowess smoother is used on the 'alpha' scale curves. Has no effect at gamma or study scales

avg — boolean. Defaults to FALSE. If set to TRUE then the average richness across the groups is computed and plotted.

col — optional vector of colors.

lwd — a number which specifies the width of the lines

log — a string that specifies if any axes are to be log transformed, options include 'x', 'y' or 'xy' in which either the x-axis, y-axis, or both axes are log transformed respectively

leg_loc — a string that specifies the location of the legend, options include: 'lowerleft', 'topleft', 'loweright','topright'

one_panel — boolean. Defaults to FALSE. If set to TRUE then the alpha scale and gamma scale curves are put on the same graph.

... — other arguments to provide to rarefaction

Examples

```
data(inv_comm)
data(inv_plot_attr)
inv_mob_in = make_mob_in(inv_comm, inv_plot_attr, coord_names = c('x', 'y'))
# random individual based rarefaction curves
```

```
par(mfrow=c(1,2))
plot_rarefaction(inv_mob_in, 'group', 'uninvaded', 'IBR',
                 leg_loc='bottomright')
plot_rarefaction(inv_mob_in, 'group', 'uninvaded', 'IBR',
                 log='xy')
# random sample based rarefaction curves
plot_rarefaction(inv_mob_in, 'group', 'uninvaded', 'SBR', log='xy',
                 leg_loc='bottomright')
# spatial sample based rarefaction curves
plot_rarefaction(inv_mob_in, 'group', 'uninvaded', 'sSBR', log='xy',
                 leg_loc='bottomright', avg = TRUE, smooth = TRUE)
```

`rarefaction` *Rarefied Species Richness*

Description

The expected number of species given a particular number of individuals or samples under random and spatially explicit nearest neighbor sampling

Usage

```
rarefaction(
  x,
  method,
  effort = NULL,
  coords = NULL,
  latlong = NULL,
  dens_ratio = 1,
  extrapolate = FALSE,
  return_NA = FALSE,
  quiet_mode = FALSE,
  spat_algo = NULL,
  sd = FALSE
)
```

Arguments

`x`	can either be a: 1) mob_in object, 2) community matrix-like object in which rows represent plots and columns represent species, or 3) a vector which contains the abundance of each species.
`method`	a character string that specifies the method of rarefaction curve construction it can be one of the following: • `'IBR'` ... individual-based rarefaction in which species are accumulated by randomly sampling individuals

- 'SBR' ... sample-based rarefaction in which species are accumulated by randomly sampling samples (i.e., plots). Note that within plot spatial aggregation is maintained with this approach. Although this curve is implemented here, it is not used in the current version of the MoB framework
- 'nsSBR' ... non-spatial, sampled-based rarefaction in which species are accumulated by randomly sampling samples that represent a spatially random sample of individuals (i.e., no with-in plot spatial aggregation). The argument dens_ratio must also be set otherwise this sampling results in a curve identical to the IBR (see Details).
- 'sSBR' ... spatial sample-based rarefaction in which species are accumulated by including spatially proximate samples first.
- 'spexSBR' ... spatially-explicit sample-based rarefaction in which species are accumulated as in 'sSBR' but sampling effort is not measured by no. of samples, but by cumulative distance or cumulative area as specified by 'spat_algo' (see details)

effort — optional argument to specify what number of individuals, number of samples, or spatial sampling effort (i.e., cumulative distance or area) depending on 'method' to compute rarefied richness as. If not specified all possible values from 1 to the maximum sampling effort are used

coords — an optional matrix of geographic coordinates of the samples. Only required when using the spatial rarefaction method and this information is not already supplied by x. The first column should specify the x-coordinate (e.g., longitude) and the second coordinate should specify the y-coordinate (e.g., latitude)

latlong — Boolean if coordinates are latitude-longitude decimal degrees

dens_ratio — the ratio of individual density between a reference group and the community data (i.e., x) under consideration. This argument is used to rescale the rarefaction curve when estimating the effect of individual density on group differences in richness.

extrapolate — Boolean which specifies if richness should be extrapolated when effort is larger than the number of individuals using the chao1 method. Defaults to FALSE in which case it returns observed richness. Extrapolation is only implemented for individual-based rarefaction (i.e., method = 'indiv')

return_NA — Boolean defaults to FALSE in which the function returns the observed S when effort is larger than the number of individuals or number of samples (depending on the method of rarefaction). If set to TRUE then NA is returned. Note that this argument is only relevant when extrapolate = FALSE.

quiet_mode — Boolean defaults to FALSE, if TRUE then warnings and other non-error messages are suppressed.

spat_algo — character string that can be either: 'kNN', 'kNCN', or 'convexhull' for k-nearest neighbor, k-nearest centroid neighbor sampling, or convex-hull polygon calculation respectively. It defaults to k-nearest neighbor which is a more computationally efficient algorithm that closely approximates the potentially more correct k-NCN algo (see Details). Currently, 'kNN' and 'k-NCN' are available for method 'ssBR', while 'kNN' 'convexhull' are available for method 'spexSBR'.

sd — Boolean defaults to FALSE, if TRUE then standard deviation of richness is also returned using the formulation of Heck 1975 Eq. 2.

Details

The analytical formulas of Cayuela et al. (2015) are used to compute the random sampling expectation for the individual and sampled based rarefaction methods. The spatially constrained rarefaction curve (Chiarucci et al. 2009) also known as the sample-based accumulation curve (Gotelli and Colwell 2001) can be computed in one of two ways which is determined by the argument `spat_algo`. In the kNN approach each plot is accumulated by the order of their spatial proximity to the original focal cell. If plots have the same distance from the focal plot then one is chosen randomly to be sampled first. In the kNCN approach, a new centroid is computed after each plot is accumulated, then distances are recomputed from that new centroid to all other plots and the next nearest is sampled. The kNN is faster because the distance matrix only needs to be computed once, but the sampling of kNCN which simultaneously minimizes spatial distance and extent is more similar to an actual person searching a field for species. For both kNN and kNCN, each plot in the community matrix is treated as a starting point and then the mean of these n possible accumulation curves is computed.

For individual-based rarefaction if effort is greater than the number of individuals and `extrapolate = TRUE` then the Chao1 method is used (Chao 1984, 1987). The code used to perform the extrapolation was ported from `iNext::D0.hat` found at https://github.com/JohnsonHsieh/iNEXT. T. C. Hsieh, K. H. Ma and Anne Chao are the original authors of the `iNEXT` package.

If effort is greater than sample size and `extrapolate = FALSE` then the observed number of species is returned.

Standard deviation of richness can only be computed for individual based rarefaction and it is assigned as an attribute (see examples). The code for this computation was ported from vegan::rarefy (Oksansen et al. 2022)

Value

A vector of rarefied species richness values

Author(s)

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References

Cayuela, L., N.J. Gotelli, & R.K. Colwell (2015) Ecological and biogeographic null hypotheses for comparing rarefaction curves. Ecological Monographs, 85, 437-454. Appendix A: http://esapubs.org/archive/mono/M085/01 A.php

Chao, A. (1984) Nonparametric estimation of the number of classes in a population. Scandinavian Journal of Statistics, 11, 265-270.

Chao, A. (1987) Estimating the population size for capture-recapture data with unequal catchability. Biometrics, 43, 783-791.

Chiarucci, A., G. Bacaro, D. Rocchini, C. Ricotta, M. Palmer, & S. Scheiner (2009) Spatially constrained rarefaction: incorporating the autocorrelated structure of biological communities into sample-based rarefaction. Community Ecology, 10, 209-214.

Gotelli, N.J. & Colwell, R.K. (2001) Quantifying biodiversity: procedures and pitfalls in the measurement and comparison of species richness. Ecology Letters, 4, 379-391.

Heck, K.L., van Belle, G. & Simberloff, D. (1975). Explicit calculation of the rarefaction diversity measurement and the determination of sufficient sample size. Ecology 56, 1459–1461.

Oksanen, J. et al. 2022. Vegan: community ecology package. R package version 2.6-4. https://CRAN.R-project.org/package=vegan

Examples

```
data(inv_comm)
data(inv_plot_attr)
sad = colSums(inv_comm)
inv_mob_in = make_mob_in(inv_comm, inv_plot_attr, coord_names = c('x', 'y'))
# rarefaction can be performed on different data inputs
# all three give same answer
# 1) the raw community site-by-species matrix
rarefaction(inv_comm, method='IBR', effort=1:10)
# 2) the SAD of the community
rarefaction(inv_comm, method='IBR', effort=1:10)
# 3) a mob_in class object
# the standard deviation of the richness estimates for IBR may be returned
# which is helpful for computing confidence intervals
S_n <- rarefaction(inv_comm, method='IBR', effort=1:10, sd=TRUE)
attr(S_n, 'sd')
plot(1:10, S_n, ylim=c(0,8), type = 'n')
z <- qnorm(1 - 0.05 / 2)
hi <- S_n + z * attr(S_n, 'sd')
lo <- S_n - z * attr(S_n, 'sd')
attributes(hi) <- NULL
attributes(lo) <- NULL
polygon(c(1:10, 10:1),  c(hi, rev(lo)), col='grey', border = NA)
lines(1:10, S_n, type = 'o')
# rescaling of individual based rarefaction
# when the density ratio is 1 the richness values are
# identical to the unscaled rarefaction
rarefaction(inv_comm, method='IBR', effort=1:10, dens_ratio=1)
# however the curve is either shrunk when density is higher than
# the reference value (i.e., dens_ratio < 1)
rarefaction(inv_comm, method='IBR', effort=1:10, dens_ratio=0.5)
# the curve is stretched when density is lower than the
# reference value (i.e., dens_ratio > 1)
rarefaction(inv_comm, method='IBR', effort=1:10, dens_ratio=1.5)
# sample based rarefaction under random sampling
rarefaction(inv_comm, method='SBR')

# sampled based rarefaction under spatially explicit nearest neighbor sampling
rarefaction(inv_comm, method='sSBR', coords=inv_plot_attr[ , c('x','y')],
            latlong=FALSE)
# the syntax is simpler if supplying a mob_in object
rarefaction(inv_mob_in, method='sSBR', spat_algo = 'kNCN')
rarefaction(inv_mob_in, method='sSBR', spat_algo = 'kNN')
rarefaction(inv_mob_in, method='spexSBR', spat_algo = 'kNN')
```

subset.mob_in *Subset the rows of the mob data input object*

Description

This function subsets the rows of comm, env, and spat attributes of the mob_in object

Usage

```
## S3 method for class 'mob_in'
subset(x, subset, type = "string", drop_levels = FALSE, ...)
```

Arguments

x	an object of class mob_in created by make_mob_in
subset	expression indicating elements or rows to keep: missing values are taken as false.
type	specifies the type of object the argument subset specifies, may be: string, integer, or logical, defaults to string
drop_levels	Boolean if TRUE unused levels are removed from factors in mob_in$env
...	parameters passed to other functions

Examples

```
data(inv_comm)
data(inv_plot_attr)
inv_mob_in = make_mob_in(inv_comm, inv_plot_attr, coord_names = c('x', 'y'))
subset(inv_mob_in, group == 'invaded')
subset(inv_mob_in, 1:4, type='integer')
subset(inv_mob_in, 1:4, type='integer', drop_levels=TRUE)
sub_log = c(TRUE, FALSE, TRUE, rep(FALSE, nrow(inv_mob_in$comm) - 3))
subset(inv_mob_in, sub_log, type='logical')
```

tank_comm *Cattle tank data set*

Description

Species counts of aquatic macro-invertebrates from experimental freshwater ponds ("cattle tanks") with two different nutrient treatments.

Details

`tank_comm` is a site-by-species matrix with individual counts.

`tank_plot_attr` is a data frame with corresponding site variables. The column `group` specifies whether a pond has received a "high" or "low" nutrient treatment. The columns `x` and `y` contain the spatial coordinates of the sites.

The data were adapted from Chase (2010).

References

Chase, J. M. (2010). Stochastic community assembly causes higher biodiversity in more productive environments. Science. 328:1388-1391.

Examples

```
data(tank_comm)
data(tank_plot_attr)
tank_mob_in = make_mob_in(tank_comm, tank_plot_attr)
```

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