## Package 'MultiTraits'

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Type Package

Title Analyzing and Visualizing Multidimensional Plant Traits

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**Description** Implements analytical methods for multidimensional plant traits, including Competitors-

Stress tolerators-Ruderals strategy analysis using leaf traits, Leaf-Height-Seed strategy analysis, Niche Periodicity Table analysis, and Trait Network analysis. Provides functions for data analysis, visualization, and network metrics calculation. Meth-

ods are based on Grime (1974) <doi:10.1038/250026a0>, Pierce et al. (2017) <doi:10.1111/1365-2435.12882>, West-

oby (1998) <doi:10.1023/A:1004327224729>, Yang et al. (2022) <doi:10.1016/j.foreco.2022.120540>, Winemiller et al. (2015) <doi:10.1111/ele.12462>, He et al. (2020) <doi:10.1016/j.tree.2020.06.003>.

Imports ggtern,igraph,Hmisc,corrplot,scatterplot3d,vegan,ggrepel

**Depends** R (>= 4.0.0), ggplot2

**Suggests** knitr,rmarkdown,testthat (>= 3.0.0),devtools

License GPL-3

**Encoding UTF-8** 

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## Description

This function processes a dataframe containing leaf traits (LA, LDMC, SLA) and applies the Strate\_CSR function to each row.

## Usage

CSR(data)

## **Arguments**

data

A dataframe containing columns for LA (Leaf Area), LDMC (Leaf Dry Matter Content), and SLA (Specific Leaf Area).

## Value

A dataframe with the original input data and additional columns:

- C: Competitive strategy score
- S: Stress-tolerant strategy score
- R: Ruderal strategy score
- type: The dominant CSR strategy type

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#### References

- 1. Grime, J.P. (1974). Vegetation classification by reference to strategies. Nature, 250, 26–31.
- 2. Pierce, S., Negreiros, D., Cerabolini, B.E.L., Kattge, J., Díaz, S., et al. (2017). A global method for calculating plant CSR ecological strategies applied across biomes world-wide. Funct Ecol, 31: 444-457.

#### **Examples**

```
LA <- c(369615.7, 11.8, 55.7, 36061.2, 22391.8, 30068.1, 31059.5, 29895.1) LDMC <- c(25.2, 39.7, 13.3, 35.5, 33.2, 36.1, 35.2, 34.9) SLA <- c(17.4, 6.6, 34.1, 14.5, 8.1, 12.1, 9.4, 10.9) traits <- data.frame(LA, LDMC, SLA) CSR(data = traits)
```

CSR\_plot

Create a ternary plot of CSR strategies

#### **Description**

This function creates a ternary plot of Competition-Stress-Ruderal (CSR) strategies using the ggtern package.

## Usage

## **Arguments**

data	A dataframe containing required columns: C, S, R (numeric values between 0-1) and type (categorical classification)
point_size	Numeric, diameter of plot points (default = 3)
point_shape	Numeric, symbol code for data points (default = 21, circle with border)
expand_margin	Numeric, coefficient for plot margin expansion (default = 1)
custom_colors	Character vector specifying hex color codes for categorical types

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#### **Details**

This function implements:

- Configurable point attributes (size, shape)
- Adjustable plot boundaries
- User-defined color schemes for categories
- Automated legend column optimization
- · Standardized legend positioning
- Reference grid and directional indicators

#### Value

A ggplot object representing the ternary plot of CSR strategies.

#### References

- 1. Grime, J.P. (1974). Vegetation classification by reference to strategies. Nature, 250, 26–31.
- 2. Pierce, S., Negreiros, D., Cerabolini, B.E.L., Kattge, J., Díaz, S., et al. (2017). A global method for calculating plant CSR ecological strategies applied across biomes world-wide. Funct Ecol, 31: 444-457.

### **Examples**

```
data(PFF)
head(PFF)
traits <- data.frame(LA=PFF$Leaf_area, LDMC=PFF$LDMC, SLA=PFF$SLA)
head(traits)
result <- CSR(data = traits)
head(result)
CSR_plot(data=result)</pre>
```

LHS

Calculate LHS (Leaf-Height-Seed) Strategy

## **Description**

This function calculates the LHS strategy for plant species based on their SLA (Specific Leaf Area), Height, and Seed Mass values.

#### Usage

LHS(data)

#### **Arguments**

data

A data frame containing columns for SLA, Height, and SeedMass.

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#### **Details**

The function calculates median values for SLA, Height, and SeedMass from the input data. It then determines the LHS strategy for each species based on whether its trait values are less than or equal to (S) or greater than (L) the median values.

The resulting strategy is a combination of three letters (S or L) representing Leaf (SLA), Height, and Seed (SeedMass) respectively, separated by hyphens.

#### Value

A data frame with an additional column 'LHS\_strategy' containing the calculated LHS strategy.

#### References

- 1. Westoby, M. (1998). A leaf-height-seed (LHS) plant ecology strategy scheme. Plant and Soil, 199, 213–227. https://doi.org/10.1023/A:1004327224729
- 2. Yang, J., Wang, Z., Zheng, Y., & Pan, Y. (2022). Shifts in plant ecological strategies in remnant forest patches along urbanization gradients. Forest Ecology and Management, 524, 120540. https://doi.org/10.1016/j.foreco.2022.120540

#### **Examples**

```
data(PFF)
pff <- PFF[, c("SLA", "Height", "SeedMass")]
result <- LHS(pff)
head(result)</pre>
```

LHS\_plot

Generate a 3D scatterplot of plant traits

## **Description**

This function creates a three-dimensional scatterplot of plant traits (Specific Leaf Area, Height, and Seed Mass) based on the Leaf-Height-Seed (LHS) plant ecology strategy scheme.

#### Usage

```
LHS_plot(
  data,
  colors = c("#30123BFF", "#4777EFFF", "#1BD0D5FF", "#62FC6BFF", "#D2E935FF",
     "#FE9B2DFF", "#DB3A07FF", "#7A0403FF"),
  log_transform = TRUE
)
```

#### **Arguments**

data A data frame containing columns: SLA, Height, SeedMass, and LHS\_strategy.

colors A vector of colors for different LHS strategies. Default is a predefined color palette.

log\_transform Logical, indicating whether to log-transform the data. Default is TRUE.

#### **Details**

The function performs the following steps: Checks if the input data contains the required columns. Converts LHS\_strategy to a factor. Optionally log-transforms the data based on the log\_transform parameter. Creates a 3D scatterplot using (potentially log-transformed) values of SLA, Height, and Seed Mass. Colors points based on LHS strategy. Adds a legend to identify different LHS strategies.

#### Value

A 3D scatterplot of SLA, Height, and Seed Mass (optionally log-transformed), with points colored by LHS strategy.

#### References

- 1. Westoby, M. (1998). A leaf-height-seed (LHS) plant ecology strategy scheme. Plant and Soil, 199, 213–227. https://doi.org/10.1023/A:1004327224729
- 2. Yang, J., Wang, Z., Zheng, Y., & Pan, Y. (2022). Shifts in plant ecological strategies in remnant forest patches along urbanization gradients. Forest Ecology and Management, 524, 120540. https://doi.org/10.1016/j.foreco.2022.120540

## **Examples**

```
data(PFF)
pff <- PFF[, c("SLA", "Height", "SeedMass")]
result <- LHS(pff)
LHS_plot(result)
LHS_plot(result, log_transform = FALSE)</pre>
```

LHS\_strategy\_scheme

Create a table of Leaf-Height-Seed (LHS) strategy types

## Description

This function generates a data frame containing different plant growth strategies based on the Leaf-Height-Seed (LHS) scheme. Each strategy is described by a combination of traits and their corresponding ecological interpretation.

#### Usage

```
LHS_strategy_scheme()
```

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#### Value

A data frame with two columns:

**type** Character vector of LHS strategy combinations (e.g., "L-L-L", "L-L-S", etc.) **strategy** Character vector describing the ecological strategy for each type

#### References

- 1. Westoby, M. (1998). A leaf-height-seed (LHS) plant ecology strategy scheme. Plant and Soil, 199, 213–227. https://doi.org/10.1023/A:1004327224729
- 2. Yang, J., Wang, Z., Zheng, Y., & Pan, Y. (2022). Shifts in plant ecological strategies in remnant forest patches along urbanization gradients. Forest Ecology and Management, 524, 120540. https://doi.org/10.1016/j.foreco.2022.120540

## **Examples**

LHS\_strategy\_scheme()

NPT

Perform nested principal component analysis (PCA of PCAs) for ecological niche periodicity

## Description

This function conducts a 'PCA of PCAs' to analyze ecological niche periodicity based on multiple trait dimensions.

#### **Usage**

NPT(data, dimension)

#### **Arguments**

data A data frame containing species trait data.

dimension A list of character vectors, each representing a trait dimension with correspond-

ing column names from the data.

## **Details**

The function performs the following steps:

- 1. Checks and cleans input data, removing rows with NA values
- 2. Conducts first-level PCA for each trait dimension
- 3. Extracts PC1 and PC2 scores from each first-level PCA
- 4. Combines all PC scores and performs a second-level PCA
- 5. Returns summary statistics and results from both levels of analysis

NPT\_plot

#### Value

A list containing three elements:

PCA\_first A data frame summarizing the first-level PCA results for each dimension

PCA\_second A matrix of species scores from the second-level PCA result The complete rda object from the second-level PCA

#### References

- 1. Winemiller, K. O., Fitzgerald, D. B., Bower, L. M., & Pianka, E. R. (2015). Functional traits, convergent evolution, and periodic tables of niches. Ecology letters, 18(8), 737-751. https://doi.org/10.1111/ele.12462
- 2. Yu, R., Huang, J., Xu, Y., Ding, Y., & Zang, R. (2020). Plant functional niches in forests across four climatic zones: Exploring the periodic table of niches based on plant functional traits. Frontiers in Plant Science, 11, 841. https://doi.org/10.3389/fpls.2020.00841

## **Examples**

```
data(PFF)
PFF[,3:20] <- log(PFF[,3:20])
traits_dimension <- list(
   grow = c("SLA","Leaf_area","LDMC","SRL","Leaf_Nmass","Leaf_Pmass","Root_Nmass"),
   survive = c("Height","Leaf_Cmass","Root_Cmass","Leaf_CN","Leaf_NP","Leaf_CP","Root_CN"),
   reproductive = c("SeedMass","FltDate","FltDur")
)
result <- NPT(data = PFF, dimension = traits_dimension)
result</pre>
```

NPT\_plot

Plot results from nested principal component analysis

## Description

This function creates a visualization of the results from the nested principal component analysis (NPT function) for ecological niche periodicity.

## Usage

```
NPT_plot(pca_obj, group = NULL)
```

#### **Arguments**

pca\_obj An rda object returned by the second-level PCA in the NPT function.

group A vector or factor specifying the grouping of samples.

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#### **Details**

The function creates a biplot that includes:

- 1. Sample points colored by group
- 2. Species scores represented as arrows
- 3. Species labels positioned using ggrepel to avoid overlapping

The plot also includes dashed lines at x=0 and y=0, and displays the percentage of variance explained by each principal component on the axes.

#### Value

A ggplot object representing a biplot of species scores and sample points.

#### References

- 1. Winemiller, K. O., Fitzgerald, D. B., Bower, L. M., & Pianka, E. R. (2015). Functional traits, convergent evolution, and periodic tables of niches. Ecology letters, 18(8), 737-751. https://doi.org/10.1111/ele.12462
- 2. Yu, R., Huang, J., Xu, Y., Ding, Y., & Zang, R. (2020). Plant functional niches in forests across four climatic zones: Exploring the periodic table of niches based on plant functional traits. Frontiers in Plant Science, 11, 841. https://doi.org/10.3389/fpls.2020.00841

#### **Examples**

PFF

Plant Functional Traits Dataset from Ponderosa Pine Forests Flora (PFF)

#### **Description**

A dataset containing functional traits for 133 plant species commonly found in southwestern USA Pinus ponderosa var. scopulorum P. & C. Lawson (ponderosa pine) forests.

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## Usage

**PFF** 

#### **Format**

A data frame with 137 rows and 20 variables:

family Plant family

species Plant species

Height Canopy height (cm)

Leaf\_area Leaf area (mm^2)

LDMC Leaf dry matter content (%)

**SLA** Specific leaf area (mm^2/mg)

**SRL** Specific root length (m/g)

**SeedMass** Seed mass (mg)

FltDate mean Flowering date (Julian day)

FltDur mean Flowering duration (days)

**k\_value** decomposition decay constant, where proportion of original mass remaining = exp(- k-value\*0.926)

**Leaf\_Cmass** Leaf carbon content (% dry mass)

**Leaf\_Nmass** Leaf nitrogen content (% dry mass)

Leaf\_CN Leaf carbon to nitrogen ratio

Leaf\_Pmass Leaf phosphorus content (% dry mass)

Leaf\_NP Leaf nitrogen to phosphorus ratio

**Leaf\_CP** Leaf carbon to phosphorus ratio

**Root\_Cmass** Root carbon content (% dry mass)

**Root\_Nmass** Root nitrogen content (% dry mass)

**Root\_CN** Root carbon to nitrogen ratio

#### **Details**

This dataset contains measurements of a core set of functional traits that reflect aspects of each species' ability to disperse, establish, acquire water and nutrients, and photosynthesize. Traits include specific leaf area (SLA), height, seed mass, specific root length (SRL), leaf and fine root nitrogen concentration, leaf phosphorus concentration, and leaf dry matter content (LDMC). Julian flowering date and flowering duration were also obtained for each species. Leaf litter decomposition rates were measured on 103 species.

#### Source

Laughlin, D. C., Leppert, J. J., Moore, M. M., & Sieg, C. H. (2010). A multi-trait test of the leaf-height-seed plant strategy scheme with 133 species from a pine forest flora. Functional Ecology, 24(3), 485-700.

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#### **Examples**

data(PFF)
head(PFF)

Strate\_CSR

Calculate CSR (Competition-Stress-Ruderal) Strategy

## Description

This function calculates the CSR strategy based on leaf traits.

## Usage

```
Strate_CSR(LA, LDMC, SLA)
```

## Arguments

LA Leaf area in mm<sup>2</sup>

LDMC Leaf dry matter content in %
SLA Specific leaf area in mm^2/mg

#### Value

A list containing:

- C: Proportion of competition strategy
- S: Proportion of stress-tolerance strategy
- R: Proportion of ruderal strategy
- type: Type of CSR strategy

## References

- 1. Grime, J.P. (1974). Vegetation classification by reference to strategies. Nature, 250, 26–31.
- 2. Pierce, S., Negreiros, D., Cerabolini, B.E.L., Kattge, J., Díaz, S., et al. (2017). A global method for calculating plant CSR ecological strategies applied across biomes world-wide. Funct Ecol, 31: 444-457.

## **Examples**

```
Strate_CSR(LA = 369615.7, LDMC = 25.2, SLA = 17.4)
```

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TN	Generate Plant Trait Network	

## **Description**

This function creates a network graph from a plant trait correlation matrix, applying thresholds for correlation strength and significance.

#### Usage

```
TN(traits_matrix, rThres = 0.2, pThres = 0.05, method = "pearson")
```

## **Arguments**

traits_matrix	A numeric matrix where each column represents a plant trait and each row represents a sample.
rThres	Numeric, threshold for correlation coefficient, default is 0.2. Correlations with absolute values below this threshold are set to zero.
pThres	Numeric, threshold for p-value, default is 0.05. Only correlations with p-values below this threshold are included in the network.
method	Character, specifies the correlation method to use: "pearson" (default) or "spearman".

#### **Details**

The function performs the following steps:

- 1. Calculates Pearson correlation coefficients and p-values for the trait matrix.
- 2. Applies correlation coefficient and p-value thresholds to filter relationships.
- 3. Constructs a weighted undirected graph from the filtered correlation matrix.
- 4. Removes self-loops and isolated nodes from the graph.
- 5. Adds correlation coefficients as edge attributes.

#### Value

Returns an igraph object representing the trait network.

#### References

- 1. He, N., Li, Y., Liu, C., et al. (2020). Plant trait networks: improved resolution of the dimensionality of adaptation. Trends in Ecology & Evolution, 35(10), 908-918. https://doi.org/10.1016/j.tree.2020.06.003
- 2. Li, Y., Liu, C., Sack, L., Xu, L., Li, M., Zhang, J., & He, N. (2022). Leaf trait network architecture shifts with species-richness and climate across forests at continental scale. Ecology Letters, 25(6), 1442-1457. https://doi.org/10.1111/ele.14009

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## **Examples**

TN\_corr

Calculate and Visualize Plant Trait Correlation Network

## Description

This function calculates correlation coefficients for given plant traits and generates a correlation network plot.

## Usage

```
TN_corr(traits_matrix, rThres = 0.2, pThres = 0.05, method = "pearson")
```

## **Arguments**

traits_matrix	A numeric matrix where each column represents a plant trait and each row represents a sample.
rThres	Numeric, threshold for correlation coefficient, default is 0.2. Only correlations with absolute values above this threshold will be displayed in the plot.
pThres	Numeric, threshold for p-value, default is 0.05. Only correlations with p-values below this threshold will be displayed in the plot.
method	Character, specifies the correlation method to use: "pearson" (default) or "spearman".

#### **Details**

The function first calculates Pearson correlation coefficients between traits, then adjusts p-values using the FDR method. Finally, it plots the correlation network using the corrplot package. The plot displays only correlations that meet both the correlation coefficient and p-value thresholds.

#### Value

Returns a correlation network plot object.

TN\_metrics

#### References

1. He, N., Li, Y., Liu, C., et al. (2020). Plant trait networks: improved resolution of the dimensionality of adaptation. Trends in Ecology & Evolution, 35(10), 908-918. https://doi.org/10.1016/j.tree.2020.06.003

2. Li, Y., Liu, C., Sack, L., Xu, L., Li, M., Zhang, J., & He, N. (2022). Leaf trait network architecture shifts with species-richness and climate across forests at continental scale. Ecology Letters, 25(6), 1442-1457. https://doi.org/10.1111/ele.14009

## **Examples**

TN\_metrics

Calculate Node and Global Metrics for Trait Networks

#### Description

This function computes various node and global metrics for a trait network graph.

#### Usage

```
TN_metrics(graph)
```

#### **Arguments**

graph

An igraph object representing the trait network, typically generated by the TN function.

#### Value

A list containing two data frames:

node A data frame with node-level metrics including degree, closeness, betweenness,

and local clustering coefficient.

global A data frame with global metrics including edge density, diameter, average path

length, average clustering coefficient, and modularity.

TN\_plot

#### References

1. He, N., Li, Y., Liu, C., et al. (2020). Plant trait networks: improved resolution of the dimensionality of adaptation. Trends in Ecology & Evolution, 35(10), 908-918. https://doi.org/10.1016/j.tree.2020.06.003

2. Li, Y., Liu, C., Sack, L., Xu, L., Li, M., Zhang, J., & He, N. (2022). Leaf trait network architecture shifts with species-richness and climate across forests at continental scale. Ecology Letters, 25(6), 1442-1457. https://doi.org/10.1111/ele.14009

## **Examples**

TN\_plot

Plot Trait Network Graph

## **Description**

This function visualizes the trait network graph generated by the TN function.

#### Usage

```
TN_plot(graph, style = 1, vertex.size = 20, vertex.label.cex = 0.6)
```

## **Arguments**

graph An igraph object representing the trait network.

style A numeric value that determines the plotting style (default is 1).

vertex.size Numeric value for the size of vertices in the plot (default is 20).

vertex.label.cex

Numeric value for the scaling factor of vertex labels (default is 0.6).

#### Details

The function uses the cluster\_fast\_greedy algorithm to identify communities in the graph and assigns community membership to vertices. It offers two plotting styles:

- Style 1: Plots the community structure.
- Style 2: Plots the graph in a circular layout with vertex colors representing communities. The vertex size and label size can be customized using vertex.size and vertex.label.cex parameters respectively.

TN\_plot

## Value

An object of class igraph. This function generates a visualization of the trait network graph. When style = 1, it displays a community structure plot. When style = 2, it displays a circular layout plot where vertex colors represent community membership, edge thickness represents correlation strength, and edge color represents the sign of the correlation (black for positive, red for negative).

#### References

- 1. He, N., Li, Y., Liu, C., et al. (2020). Plant trait networks: improved resolution of the dimensionality of adaptation. Trends in Ecology & Evolution, 35(10), 908-918. https://doi.org/10.1016/j.tree.2020.06.003
- 2. Li, Y., Liu, C., Sack, L., Xu, L., Li, M., Zhang, J., & He, N. (2022). Leaf trait network architecture shifts with species-richness and climate across forests at continental scale. Ecology Letters, 25(6), 1442-1457. https://doi.org/10.1111/ele.14009

#### **Examples**

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