

# Package ‘FactoClass’

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**Description** Some functions of 'ade4' and 'stats' are combined in order to obtain a partition of the rows of a data table, with columns representing variables of scales: quantitative, qualitative or frequency. First, a principal axes method is performed and then, a combination of Ward agglomerative hierarchical classification and K-means is performed, using some of the first coordinates obtained from the previous principal axes method. In order to permit different weights of the elements to be clustered, the function 'kmeansW', programmed in C++, is included. It is a modification of 'kmeans'. Some graphical functions include the option: 'gg=FALSE'. When 'gg=TRUE', they use the 'ggplot2' and 'ggrepel' packages to avoid the super-position of the labels.

**Depends** R (>= 2.10), ade4,ggplot2,ggrepel,xtable,scatterplot3d

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addgrids3d	<i>Add grids to a scatterplot3d (modified)</i>
------------	--

---

### Description

The goal of this function is to add grids on an existing plot created using the package scatterplot3d

### Usage

```
addgrids3d(x, y = NULL, z = NULL, grid = TRUE, col.grid = "grey",
           lty.grid = par("lty"), lab = par("lab"), lab.z = mean(lab[1:2]),
           scale.y = 1, angle = 40, xlim = NULL, ylim = NULL, zlim = NULL)
```

**Arguments**

x, y, z	numeric vectors specifying the x, y, z coordinates of points. x can be a matrix or a data frame containing 3 columns corresponding to the x, y and z coordinates. In this case the arguments y and z are optional
grid	specifies the facet(s) of the plot on which grids should be drawn. Possible values are the combination of "xy", "xz" or "yz". Example: grid = c("xy", "yz"). The default value is TRUE to add grids only on xy facet.
col.grid, lty.grid	color and line type to be used for grids
lab	a numerical vector of the form c(x, y, len). The values of x and y give the (approximate) number of tickmarks on the x and y axes.
lab.z	the same as lab, but for z axis
scale.y	of y axis related to x- and z axis
angle	angle between x and y axis
xlim	the x limits (min, max) of the plot
ylim	the y limits (min, max) of the plot
zlim	the z limits (min, max) of the plot.

**Note**

Users who want to extend an existing scatterplot3d graphic with the function addgrids3d, should consider to set the arguments scale.y, angle, ..., to the value used in scatterplot3d.

**Author(s)**

Alboukadel Kassambara <alboukadel.kassambara@gmail.com>

**References**

<http://www.sthda.com>

**Examples**

```
library(scatterplot3d)
data(iris)
scatterplot3d(iris[, 1:3], pch = 16, grid=TRUE, box=FALSE)
addgrids3d(iris[, 1:3], grid = c("xy", "xz", "yz"))
```

---

admi

*Admitted students to the seven careers of the Science Faculty*

---

### Description

Score obtained by each of the 445 students admitted to the seven careers of the Facultad de Ciencias of the Universidad Nacional de Colombia Bogota to the first semester of 2013, and some socio demographic information:

**carr** a factor with the careers as its levels

**mate,cien,soci,text,imag** score achieved in each of the areas of the admission exam

**exam** total score of the admission exam

**gene** gender of the admitted

**estr** socioeconomic stratum in 3 categories

**orig** geographic origin of the admitted

**edad** age of the admitted in categories

**niLE** if the admitted requires nivelation in language

**niMa** if the admitted requires nivelation in mathematics

**estr** socioeconomic stratum in 7 categories

**age** age of the admitted in years

### Usage

```
data(admi)
```

### Format

Object of class `data.frame` with 445 rows and 15 columns.

### Source

SIA: Academic Information System

### References

C.E. Pardo (2015). Estadística descriptiva multivariada. Universidad Nacional de Colombia. Facultad de Ciencias.

---

Bogota

*Localities by Stratums in Bogota City*

---

**Description**

Contingency Table that indicates the number of blocks of Bogota, in localities by stratums (DAPD 1997, p.77).

**Usage**

```
data(Bogota)
```

**Format**

Object whit class `data.frame` of 19 rows and 7 columns.

**Source**

DAPD (1997), Population, stratification and socioeconomic aspects of Bogota

**References**

C.E. Pardo y J.E. Ortiz (2004). Analisis multivariado de datos en R. Simposio de Estadistica, Cartagena Colombia.

---

cafe

*Coffee cups*

---

**Description**

Results of the mesure of some properties of twelve coffe cups

**Usage**

```
data(cafe)
```

**Format**

Object of class `data.frame` with 12 rows and 16 columns.

**Source**

R. Duarte and M. Suarez and E. Moreno and P. Ortiz (1996). Analisis multivariado por componentes principales, de cafes tostados y molidos adulterados con cereales. *Cenicafé*, 478(2):65-76

## References

C.E. Pardo (2023). Estadística descriptiva multivariada. Universidad Nacional de Colombia. Facultad de Ciencias.

---

centroids

*Centroids of the Classes of a Partition*

---

## Description

It evaluates the centroids of a partition with the weights in `rw`

## Usage

```
centroids(df, cl, rw=rep(1/nrow(df), nrow(df)))
```

## Arguments

<code>df</code>	object of class <code>data.frame</code> , with the data of variables or coordinates
<code>cl</code>	vector indicating the cluster of each element
<code>rw</code>	weight of the rows of <code>df</code> , by default the same

## Value

Object of class `list` with the following:

<code>centroids</code>	class centroids
<code>weights</code>	class weights
<code>cr</code>	correlation ratios

## Author(s)

Campo Elias Pardo <cepardot@unal.edu.co>

## Examples

```
data(iris)
centroids(iris[, -5], iris[, 5])
```

---

chisq.carac	<i>Chisquare tests of a qualitative variable by several qualitative variables</i>
-------------	---

---

**Description**

Chisquare tests are performed for the contingency tables crossing a qualitative variable named `c1` and the qualitative variables present in columns from `df`

**Usage**

```
chisq.carac(df, c1, thr=2, decr=TRUE)
```

**Arguments**

<code>df</code>	data.frame, with factors contain the categories of the qualitative variables
<code>c1</code>	factor indicating the category of each subject
<code>thr</code>	threshold of test value, if <code>decr=TRUE</code> , only the rows where <code>tval &gt;= thr</code> are returned
<code>decr</code>	if <code>decr=TRUE</code> the rows are returned in decreasing order

**Value**

Matrix with the following columns:

<code>chi2</code>	chisquare statistic
<code>dfr</code>	degree of freedom of chisquare density
<code>pval</code>	\$p\$ value
<code>tval</code>	quantil <code>qnorm(pval, lower.tail=FALSE)</code>
<code>phi2</code>	<code>phi2=chi2/n</code>

**Author(s)**

Campo Elias Pardo <cepardot@unal.edu.co>

**Examples**

```
data(DogBreeds)
round(chisq.carac(DogBreeds[, -7], DogBreeds[, 7]), 3)
round(chisq.carac(DogBreeds[, -7], DogBreeds[, 7], decr=FALSE), 3)
```

---

`cluster.carac`*Cluster Characterization by Variables*

---

**Description**

It makes the characterization of the classes or cluster considering the variables in `tabla`. These variables can be quantitative, qualitative or frequencies.

**Usage**

```
cluster.carac( tabla, class, tipo.v="d", v.lim= 2, dn=3, dm=3, neg=TRUE)
```

**Arguments**

<code>tabla</code>	object data.frame with variables of characterization, the variables must be of a single type (quantitative, qualitative or frequencies)
<code>class</code>	vector that determines the partition of the table
<code>tipo.v</code>	type of variables: quantitative("continuas"), qualitative ("nominales") or frequencies("frecuencia")
<code>v.lim</code>	test value to show the variable or category like characteristic.
<code>dn</code>	number of decimal digits for the p and test values.
<code>dm</code>	number of decimal digits for the means.
<code>neg</code>	if <code>neg=TRUE</code> , the variables or categories with negative test values are showed.

**Details**

For nominal or frequency variables it compares the percentage of the categories within each class with the global percentage. For continuous variables it compares the average within each class with the general average. Categories and variables are ordered within each class by the test values and it shows only those that pass the threshold `v.lim`.

**Value**

Object of class list. It has the characterization of each class or cluster.

**Author(s)**

Pedro Cesar del Campo <pcdelcampon@unal.edu.co>, Campo Elias Pardo <cepardot@unal.edu.co>, Mauricio Sadinle <msadinleg@unal.edu.co>

**References**

Lebart, L. and Morineau, A. and Piron, M. (1995) Statistique exploratoire multidimensionnelle, Paris.



**Examples**

```

data(DogBreeds)
DB.act <- DogBreeds[-7] # active variables
DB.function <- subset(DogBreeds,select=7)
cluster.carac(DB.act,DB.function,"ca",2.0) # nominal variables

data(iris)
iris.act <- Fac.Num(iris)$numeric
class <- Fac.Num(iris)$factor
cluster.carac(iris.act,class,"co",2.0) # continuous variables

# frequency variables
data(DogBreeds)
attach(DogBreeds)
weig<-table(FUNC,WEIG)
weig<-data.frame(weig[,1],weig[,2],weig[,3])
cluster.carac(weig, row.names(weig), "fr", 2) # frequency variables
detach(DogBreeds)

```

---

ColorAdjective

*Associations between colors and adjectives.*


---

**Description**

A group of students from Nanterre University (Paris X) were presented with a list of eleven colours: blue, yellow, red, white, pink, brown, purple, grey, black, green and orange. Each person in the group was asked to describe each color with one or more adjectives. A final list of 89 adjectives were associated with eleven colors.

**Usage**

```
data(ColorAdjective)
```

**Format**

Object of class data.frame with 89 rows and 11 columns.

**Source**

Jambu, M. and Lebeaux M.O. Cluster Analysis and Data Analysis. North-Holland. Amsterdam 1983.

**References**

Fine, J. (1996), *Iniciacion a los analisis de datos multidimensionales a partir de ejemplos*, Notas de curso, Montevideo

---

 DogBreeds

*Dog Breeds*


---

### Description

Table that describes 27 dog breeds considering their size, weight, speed, intelligence, affectivity, aggressiveness and function.

### Usage

```
data(DogBreeds)
```

### Format

Object of class data.frame with 27 rows and 7 columns with the following description:

	VARIABLE	CATEGORIES		
[,1]	Size(SIZE)	Small(sma)	Mediun(med)	Large(lar)
[,2]	Weight(WEIG)	lightweight(lig)	Mediun(med)	Heavy(hea)
[,3]	Speed(SPEE)	Low(low)	Mediun(med)	High(hig)
[,4]	Intelligence(INTE)	Low(low)	Mediun(med)	High(hig)
[,5]	Affectivity(AFFE)	Low(low)	High(hig)	
[,6]	aggressiveness(AGGR)	Low(low)	High(hig)	
[,7]	function(FUNC)	Company(com)	Hunt(hun)	Utility(uti)

### Source

Fine, J. (1996), 'Iniciacion a los analisis de datos multidimensionales a partir de ejemplos', Notas de clase, Montevideo.

### References

Brefort, A.(1982), 'Letude des races canines a partir de leurs caracteristiques qualitatives', HEC - Jouy en Josas

---

 dudi.tex

*LaTeX Tables of Coordinates and Aids to Interpretation of Principal Axis Methods*


---

### Description

Coordinates and aids of interpretation are wrote in tabular environment of LaTeX inside a Table

**Usage**

```
dudi.tex(dudi, job="", aidsC=TRUE, aidsR=TRUE, append=TRUE)
latex(obj, job="latex", tit="", lab="", append=TRUE, dec=1)
```

**Arguments**

dudi	an object of class dudi
job	a name to identify files and outputs
aidsC	if it is TRUE the coordinates and aids of interpretation of the columns are printed
aidsR	if it is TRUE the coordinates and aids of interpretation of the rows are printed
append	if it is TRUE LaTeX outputs are appended on the file
obj	object to export to LaTeX
tit	title of the table
lab	label for crossed references of LaTeX table
dec	number of decimal digits

**Details**

latex function is used to builp up a table. The aids of interpretation are obtained with inertia.dudi of ade4. A file is wrote in the work directory (job.txt) with the following tables:

**tvalp** eigenvalues

**c1** eigenvectors

**co** column coordinates

**col.abs** column contributions in percentage

**col.rel** quality of the representation of columns in percentage

**col.cum** accumulated quality of the representation of columns in percentage/100

**li** row coordinates

**row.abs** row contributions in percent

**row.rel** quality of the representation of rows in percentage

**row.cum** accumulated quality of the representation of rows in percentage/100

**Author(s)**

Campo Elias PARDO <cepardot@una1.edu.co>

**Examples**

```
data(Bogota)
coa1 <- dudi.coa(Bogota[,2:7], scannf = FALSE)
# In order to create a file: Bogota.tex in LaTeX
# dudi.tex(coa1, job="Bogota")
```

Fac.Num

*Division of qualitative and quantitative variables*

---

**Description**

An object of class `data.frame` is divided into a list with two tables, one with quantitative variables and the other with qualitative variables.

**Usage**

```
Fac.Num(tabla)
```

**Arguments**

`tabla`            object of class 'data.frame'

**Value**

It returns one list with one or two objects of class `data.frame` with the following characteristics:

`factor`            table with the qualitative variables  
`numeric`           table with the quantitative variables

**Author(s)**

Pedro Cesar Del Campo <pcdelcampon@unal.edu.co>

**Examples**

```
data(DogBreeds)
Fac.Num(DogBreeds)

data(iris)
Fac.Num(iris)
```

---

FactoClass*Combination of Factorial Methods and Cluster Analysis*

---

**Description**

Performs the factorial analysis of the data and a cluster analysis using the `nfcl` first factorial coordinates

**Usage**

```
FactoClass( dfact, metodo, dfilu = NULL , nf = 2, nfcl = 10, k.clust = 3,
            scanFC = TRUE , n.max = 5000 , n.clus = 1000 ,sign = 2.0,
            conso=TRUE , n.indi = 25,row.w = rep(1, nrow(dfact)) )
## S3 method for class 'FactoClass'
print(x, ...)
 analisis.clus(X,W)
```

**Arguments**

<code>dfact</code>	object of class data.frame, with the data of active variables.
<code>metodo</code>	function of ade4 for ade4 factorial analysis, <code>dudi.pca</code> , Principal Component Analysis; <code>dudi.coa</code> , Correspondence Analysis; <code>witwit.coa</code> , Internal Correspondence Analysis; <code>dudi.acm</code> , Multiple Correspondence Analysis ...
<code>dfilu</code>	illustrative variables (default NULL)
<code>nf</code>	number of axes to use into the factorial analysis (default 2)
<code>nfcl</code>	number of axes to use in the classification (default 10)
<code>k.clust</code>	number of classes to work (default 3)
<code>scanFC</code>	if is TRUE, it asks in the console the values <code>nf</code> , <code>nfcl</code> y <code>k.clust</code>
<code>n.max</code>	when <code>rowname(dfact)&gt;=n.max</code> , k-means is performed previous to hierarchical clustering (default 5000)
<code>n.clus</code>	when <code>rowname(fact)&gt;=n.max</code> , the previous k-means is performed with <i>n.clus</i> groups (default 1000)
<code>sign</code>	threshold test value to show the characteristic variables and modalities
<code>conso</code>	when <code>conso</code> is TRUE, the process of consolidating the classification is performed (default TRUE)
<code>n.indi</code>	number of indices to draw in the histogram (default 25)
<code>row.w</code>	vector containing the row weights if <code>metodo&lt;&gt;dudi.coa</code>
<code>x</code>	object of class FactoClass
<code>...</code>	further arguments passed to or from other methods
<code>X</code>	coordinates of the elements of a class
<code>W</code>	weights of the elements of a class

**Details**

Lebart et al. (1995) present a strategy to analyze a data table using multivariate methods, consisting of an initial factorial analysis according to the nature of the compiled data, followed by the performance of mixed clustering. The mixed clustering combines hierarchical clustering using the Ward's method with K-means clustering. Finally a partition of the data set and the characterization of each one of the classes is obtained, according to the active and illustrative variables, being quantitative, qualitative or frequency.

FactoClass is a function that connects procedures of the package ade4 to perform the analysis factorial of the data and from stats for the cluster analysis.

The function `analysis.clus` calculates the geometric characteristics of each class: size, inertia, weight and square distance to the origin.

For impression in LaTeX format see [FactoClass.tex](#)

To draw factorial planes with cluster see [plotFactoClass](#)

### Value

object of class `FactoClass` with the following:

<code>dudi</code>	object of class <code>dudi</code> from <code>ade4</code> with the specifications of the factorial analysis
<code>nfcl</code>	number of axes selected for the classification
<code>k</code>	number of classes
<code>indices</code>	table of indices obtained through WARD method
<code>cor.clus</code>	coordinates of the clusters
<code>clus.summ</code>	summary of the clusters
<code>cluster</code>	vector indicating the cluster of each element
<code>carac.cate</code>	cluster characterization by qualitative variables
<code>carac.cont</code>	cluster characterization by quantitative variables
<code>carac.frec</code>	cluster characterization by frequency active variables

### Author(s)

Pedro Cesar del Campo <[pcdelcampon@unal.edu.co](mailto:pcdelcampon@unal.edu.co)>, Campo Elias Pardo <[cepardot@unal.edu.co](mailto:cepardot@unal.edu.co)>, Ivan Diaz <[ildiazm@unal.edu.co](mailto:ildiazm@unal.edu.co)>, Mauricio Sadinle <[msadinleg@unal.edu.co](mailto:msadinleg@unal.edu.co)>

### References

Lebart, L. and Morineau, A. and Piron, M. (1995) *Statistique exploratoire multidimensionnelle*, Paris.

### Examples

```
# Cluster analysis with Correspondence Analysis
data(ColorAdjective)
FC.col <-FactoClass(ColorAdjective, dudi.coa)
6
10
5

FC.col

FC.col$dudi

# Cluster analysis with Multiple Correspondence Analysis
data(DogBreeds)
```

```

DB.act <- DogBreeds[-7] # active variables
DB.ilu <- DogBreeds[7]  # illustrative variables

FC.db <-FactoClass( DB.act, dudi.acm, k.clust = 4,
                   scanFC = FALSE, dfilu = DB.ilu, nfcl = 10)

FC.db

FC.db$clus.summ
FC.db$indices

```

---

FactoClass.tex	<i>Table of Coordinates, Aids of Interpretation of the Principal Axes and Cluster Analysis in LaTeX format.</i>
----------------	---

---

### Description

The coordinates, aids of interpretation and results of cluster analysis of an object of class FactoClass are written in tables for edition in LaTeX format and written in a file.

### Usage

```

FactoClass.tex(FC,job="",append=TRUE, dir = getwd(), p.clust = FALSE )

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

latexDF(obj, job="latex" ,tit="" ,lab="" ,append=TRUE ,dec=1,
        dir = getwd() , to.print = TRUE )
roundDF(tabla,dec=1)

```

### Arguments

FC	object of class <a href="#">FactoClass</a> .
job	A name to identify the exit.
append	if is 'TRUE' the exit in LaTeX format is added to the file.
dir	name of the directory in which the file is kept.
p.clust	the value of this parameter is 'TRUE' or 'FALSE' to print or not the cluster of each element.
tabla	object of class 'data frame'.
dec	number of decimal.
x	object of class FactoClass.tex

...	further arguments passed to or from other methods
obj	object of class data.frame.
tit	title of the table in LaTeX format.
lab	label of the table in LaTeX format.
to.print	if it is 'TRUE' the table is also printed in the console.

### Details

This function helps with the construction of tables in *LaTeX* format. Besides, it allows a easy reading of the generated results by [FactoClass](#). The function `latexDF` is an entrance to `xtable` and turns an object of class `data.frame` a table in LaTeX format.

### Value

object of class `FactoClass.tex` with the following characteristics:

<code>tvalp</code>	eigenvalues * 1000.
<code>c1</code>	eigenvectors.
<code>co</code>	coordinates of the columns.
<code>col.abs</code>	contribution of each column to the inertia of the axis (percentage).
<code>col.rel</code>	quality of representation of each column (percentage).
<code>col.cum</code>	quality of representation of each column accumulated in the subspace (percentage).
<code>li</code>	coordinates of the rows.
<code>row.abs</code>	contribution of each rows to the inertia of the axis (percentage).
<code>row.rel</code>	quality of representation of each rows (percentage).
<code>row.cum</code>	quality of representation of each rows accumulated in the subspace (percentage).
<code>indices</code>	table of indices of level generated by the Ward cluster analysis.
<code>cor.clus</code>	coordinates of the center of gravity of each cluster.
<code>clus.summ</code>	summary of the cluster.
<code>carac.cate</code>	cluster characterization by qualitative variables.
<code>carac.cont</code>	cluster characterization by quantitative variables.
<code>cluster</code>	vector indicating the cluster of each element.

### Author(s)

Pedro Cesar del Campo <pcdelcampon@una1.edu.co>, Campo Elias Pardo <cepardot@una1.edu.co>



**Examples**

```

data(DogBreeds)
DB.act <- DogBreeds[-7] # active variables
DB.ilu <- DogBreeds[7]  # illustrative variables
# MCA
FaCl <- FactoClass( DB.act, dudi.acm,
                   scanFC = FALSE, dfile = DB.ilu, nfcl = 10, k.clust = 4 )
# In order to create a file in LaTeX format
# FactoClass.tex(FaCl,job="DogBreeds1", append=TRUE)
# FactoClass.tex(FaCl,job="DogBreeds", append=TRUE , p.clust = TRUE)

```

icfes08

*Department by Levels of Schools in Colombia***Description**

Contingency Table that classifies the schools of Colombia by departments and level of the schools agree with the performance of its students.

**Usage**

```
data(icfes08)
```

**Format**

Object with class `data.frame` of 29 rows and 12 columns.

**Source**

ICFES Colombia

**References**

C.E. Pardo, M. Bécue and J.E. Ortiz (2013). Correspondence Analysis of Contingency Tables with Subpartitions on Rows and Columns. *Revista Colombiana de Estadística*, 36(1):115-144.

kmeansW

*K-means with Weights of the Elements***Description**

It is a modification of `kmeans` Hartigan-Wong algorithm to consider the weight of the elements to classify.

**Usage**

```
kmeansW(x, centers, weight = rep(1,nrow(x)),
        iter.max = 10, nstart = 1)
```

**Arguments**

x	A numeric vector, matrix or data frame.
centers	Either the number of clusters or a set of initial (distinct) cluster centres. If a number, a random set of (distinct) rows in x is chosen as the initial centres.
weight	weight of the elements of x. by default the same.
iter.max	The maximum number of iterations allowed.
nstart	If centers is a number, how many random sets should be chosen?

**Details**

With the 'Hartigan-Wong' algorithm, this function performs the *K-means* clustering diminishing inertia intra classes. In this version the Fortran code kmnsW.f was changed by C++ code kmeanw.cc programed by Camilo Jose Torres, modifying C code programed by Burkardt.

**Value**

object of class FactoClass. tex with the following characteristics:

cluster	vector indicating the cluster of each element.
...	

**Author(s)**

Camilo Jose Torres <cjtorresj@unal.edu.co>, Campo Elias Pardo <cepardot@unal.edu.co>

**References**

Hartigan, J. A. and Wong, M. A. (1979). A K-means clustering algorithm. *Applied Statistics* **28**, 100–108.

Burkardt, J. (2008). ASA136 The K-Means Algorithm. [https://people.sc.fsu.edu/~jburkardt/cpp\\_src/asa136/asa136.html](https://people.sc.fsu.edu/~jburkardt/cpp_src/asa136/asa136.html)

**Examples**

```
data(Bogota)
ac.bog <- Bogota[-1]
il.bog <- Bogota[ 1]

acs <- dudi.coa( ac.bog, nf=6 , scannf = FALSE )

kmeansW( acs$li, 7, acs$lw )
```

---

list.to.data	<i>list to data.frame</i>
--------------	---------------------------

---

**Description**

Modification of an object of class `list` into an object of class `data.frame`.

**Usage**

```
list.to.data(lista,nvar="clasif")
```

**Arguments**

<code>lista</code>	<code>list</code> that contains several <code>data.frame</code> of the same structure.
<code>nvar</code>	(Optional) Name of the new variable that considers the partition given by the elements of the list.

**Details**

This function turns an object of class `list` into an object of class `data.frame`, this function is used internally to create objects of class `data.frame` to make tables in *LaTeX* format.

**Value**

Object of class `data.frame`.

**Author(s)**

Pedro Cesar Del Campo <pcdelcampon@una1.edu.co>

**Examples**

```
A <- data.frame(r1=rnorm(5),r2=rnorm(5))
B <- data.frame(r1=rnorm(15),r2=rnorm(15))

LL <- list(A=A,B=B)
LL
list.to.data(LL)
```

---

plot.dudi

*Factorial Planes from Objects of Class dudi*


---

### Description

It plots factorial planes from objects of class dudi

### Usage

```
## S3 method for class 'dudi'
plot(x,ex=1,ey=2,xlim=NULL,ylim=NULL,main=NULL,rotx=FALSE,
     roty=FALSE,roweti=row.names(dudi$li),
     coleti=row.names(dudi$co),axislabel=TRUE,font.col="plain",
     font.row="plain",col.row="black",col.col="blue",
     alpha.col=1,alpha.row=1,cex=0.8,cex.row=0.8,cex.col=0.8,
     all.point=TRUE,Trow=TRUE,Tcol=TRUE,cframe=1.2,ucal=0,
     cex.global=1,infaxes="out",gg=FALSE,...)
sutil.grid(cgrid,scale=TRUE)
```

### Arguments

x	object of type dudi
ex	number indentifying the factor to be used as horizontal axis. Default 1
ey	number indentifying the factor to be used as vertical axis. Default 2
xlim	the x limits (x1, x2) of the plot
ylim	the y limits of the plot
main	graphic title
rotx	TRUE if you want change the sign of the horizontal coordinates. Default FALSE
roty	TRUE if you want change the sign of the vertical coordinates. Default FALSE
roweti	selected row points for the graphic. Default all points
coleti	selected column points for the graphic. Default all points
font.row	type of font for row labels. Default "plain"
font.col	type of font for column labels. Default "plain"
axislabel	if it is TRUE the axis information is written
col.row	color for row points and row labels. Default "black"
col.col	color for column points and column labels. Default "blue"
alpha.row	transparency for row points and row labels. Default cex.ilu=1
alpha.col	transparency for column points and column labels. Default cex.ilu=1
cex	global scale for the labels. Default cex=0.8
cex.row	scale for row points and row labels. Default cex.row=0.8
cex.col	scale for column points and column labels. Default cex.col=0.8

all.point	If it is TRUE, all points are outlined. Default all.point=TRUE
Trow	if it is TRUE the row points are outlined. Default TRUE
Tcol	if it is TRUE the column points are outlined. Default TRUE
cframe	scale for graphic limits
ucal	quality representation threshold (percentage) in the plane . Default ucal=0
cex.global	scale for the label sizes
infxes	place to put the axes information: "out","in","no". Default infxes="out". If infxes="out" the graphic is similar to FactoMineR graphics, otherwise the style is similar to the one in ade4, without axes information when infxes="no"
gg	If TRUE the version ggplot ggrepel is performance. Default FALSE
...	further arguments passed to or from other methods
cgrid	internal parameter
scale	internal

### Details

Plot the selected factorial plane. `sutil.grid` is used by `plot.dudi`

### Value

It graphs the factorial plane  $x,y$  using  $\$co$ ,  $\$li$  of a "dudi" object. If  $ucal > 0$ , the function `inertia.dudi` is used to calculate the quality of representation on the plane

### Author(s)

Campo Elias Pardo <cepardot@unal.edu.co> and Jhonathan Medina <jmedinau@unal.edu.co>

### Examples

```
data(Bogota)
ca <- dudi.coa(Bogota[,2:7],scannf=FALSE,nf=4)
# with ggplot2 and ggrepel
plot(ca,gg=TRUE)
dev.new()
# ade4 style
plot.dudi(ca,ex=3,ey=4,ucal=0.2,all.point=FALSE,infxes="in")
```

---

 plotcc

*Correlation circle from coordinates*


---

### Description

It plots Correlation circle from a coordinate table

### Usage

```
plotcc(x,ex=1,ey=2,cex.label=4.5,col.label="black",font.label="bold",col.arrow="black",
fullcircle=TRUE,y=NULL)
```

### Arguments

x	matrix or data.frame with coordinates
ex	the component like horizontal axis
ey	the component like vertical axis
cex.label	size of the variable labels. Default 4.5
col.label	color of the variable labels. Default black
font.label	font of the variable labels from fontface of ggplot2. Default bold
col.arrow	color of the arrows. Default black
fullcircle	if it is TRUE (default), the circle is complete
y	internal

### Details

Plot the selected factorial plane as a correlation circle for the variables from a normed PCA.

### Value

It graphs the factorial plane ex,ey using a data.frame or matrix x with axis coordinates.

### Author(s)

Jhonathan Medina <jmedin@unal.edu.co> and Campo Elias Pardo <cepardot@unal.edu.co>

### Examples

```
data(admi)
pca <- dudi.pca(admi[,2:6],scannf=FALSE,nf=2)
# fullcircle
plotcc(pca$co)
# no fullcircle
plotcc(pca$co,fullcircle=FALSE)
```

---

plotct	<i>Row and Column Profiles of a Contingency Table</i>
--------	---

---

**Description**

It plots barplot profiles of rows or columns from a contingency table including marginal profiles

**Usage**

```
plotct(x,profiles="both",legend.text=TRUE,tables=FALSE,nd=1,... )
```

**Arguments**

x	contingency table
profiles	select profiles: "both" file and column profiles in two graph devices, "row" only row profiles, "col" only column profiles
legend.text	if it is TRUE a box with legends is included at the right
tables	logical, if TRUE tables with marginals are returned
nd	number of decimals to profiles as percentages
...	further arguments passed to or from other methods

**Details**

Plot row profiles in horizontal form and columns profiles in vertical form

**Value**

if tables=TRUE, object of class `list` with the following:

ct	contingency table with row and column marginals
perR	row profile with marginal, in percent
perC	column profile with marginal, in percent

**Author(s)**

Camilo Jose Torres <cjtorresj@unal.edu.co> , Campo Elias Pardo <cepardot@unal.edu.co>

**Examples**

```
mycolors<-colors()[c(1,26,32,37,52,57,68,73,74,81,82,84,88,100)]
data(Bogota)
plotct(Bogota[,2:7],col=mycolors)
# return tables with marginals
tabs <- plotct(Bogota[,2:7],col=mycolors,tables=TRUE,nd=0)
```

---

plotFactoClass                      *Factorial Planes Showing the Classes*

---

### Description

For objects of class FactoClass it graphs a factorial plane showing the center of gravity of the cluster, and identifying with colors the cluster to which each element belongs.

### Usage

```
plotFactoClass(FC,x=1,y=2,xlim=NULL,ylim=NULL,rotx=FALSE,roty=FALSE,
               roweti=row.names(dudi$li),coleti=row.names(dudi$co),
               titre=NULL,axislabel=TRUE,col.row=1:FC$k,
               col.col="blue",cex=0.8,cex.row=0.8,cex.col=0.8,
               all.point=TRUE,Trow=TRUE,Tcol=TRUE,cframe=1.2,ucal=0,
               cex.global=1,infaxes="out",
               nclus=paste("cl", 1:FC$k, sep=""),
               cex.clu=cex.row,cstar=1,gg=FALSE)
```

### Arguments

FC	object of class <a href="#">FactoClass</a> .
x	number indentifying the factor to be used as horizontal axis. Default x=1
y	number indentifying the factor to be used as vertical axis. Default y=2
xlim	the x limits (x1, x2) of the plot
ylim	the y limits of the plot
rotx	TRUE if you want change the sign of the horizontal coordinates (default FALSE).
roty	TRUE if you want change the sign of the vertical coordinates (default FALSE).
roweti	selected row points for the graphic. Default all points.
coleti	selected column points for the graphic. Default all points.
titre	graphics title.
axislabel	if it is TRUE the axis information is written.
col.row	color for row points and row labels. Default 1:FC\$k.
col.col	color for column points and column labels. Default "grey55".
cex	global scale for the labels. Default cex=0.8.
cex.row	scale for row points and row labels. Default cex.row=0.8.
cex.col	scale for column points and column labels. Default cex.col=0.8.
cex.clu	scale for cluster points and cluster labels. (default cex.row).
all.point	if it is TRUE, all points are outlined. Default all.point=TRUE.
Trow	if it is TRUE the row points are outlined. Default TRUE.



Tcol	if it is TRUE the column points are outlined. Default TRUE.
nclus	labels for the clusters (default cl1, cl2, ...)
cframe	scale for graphics limits
ucal	quality Representation Threshold in the plane. Default ucal=0
cex.global	scale for the label sizes
infaxes	place to put the axes information: "out","in","no". Default infaxes="out". If infaxes="out" the graphic is similar to FactoMineR graphics, otherwise the style is similar to the one in ade4, without axes information when infaxes="no"
cstar	length of the rays between the centroids of the classes and their points
gg	If TRUE the version ggplot ggrepel is performance. Default FALSE

### Details

It draws the factorial plane with the clusters. Only for objects FactoClass see [FactoClass](#). The factorial plane is drawn with `planfac` and the classes are projected with `s.class` of `ade4`

### Value

It draws the factorial plane `x`, `y` using `$co`, `$li` of the object of class `FactoClass`. If `ucal > 0`, the function `inertia.dudi` is used to calculate the quality of representation in the plane.

### Author(s)

Campo Elias Pardo <cepardot@unal.edu.co> Pedro Cesar del Campo <pcdelcampon@unal.edu.co>,

### Examples

```
data(Bogota)
Bog.act <- Bogota[-1]
Bog.ilu <- Bogota[ 1]

FC.Bogota<-FactoClass(Bog.act, dudi.coa,Bog.ilu,nf=2,nfc1=5,k.clust=5,scanFC=FALSE)

plotFactoClass(FC.Bogota,titre="First Factorial Plane from the SCA of Bogota's Blocks",
  col.row=c("maroon2","orchid4","darkgoldenrod2","dark red","aquamarine4"))
```

---

plotfp

*Factorial Planes from Coordinates*

---

### Description

It plots factorial planes from a coordinate table

**Usage**

```
plotfp(co,x=1,y=2,eig=NULL,cal=NULL,ucal=0,xlim=NULL,ylim=NULL,main=NULL,rotx=FALSE,
       roty=FALSE,eti=row.names(co),axislabel=TRUE,col.row="black",cex=0.8,cex.row=0.8,
       all.point=TRUE,cframe=1.2,cex.global=1,infaxes="out",asp=1,gg=FALSE)
```

**Arguments**

<code>co</code>	matrix or data.frame with coordinates
<code>x</code>	the component like horizontal axis
<code>y</code>	the component like vertical axis
<code>eig</code>	numeric with the eigenvalues
<code>cal</code>	matrix or data.frame with the square cosinus
<code>ucal</code>	quality representation threshold (percentage) in the plane . Default <code>ucal=0</code>
<code>xlim</code>	the x limits (x1, x2) of the plot
<code>ylim</code>	the y limits of the plot
<code>main</code>	graphic title
<code>rotx</code>	TRUE if you want change the sign of the horizontal coordinates. Default FALSE
<code>roty</code>	TRUE if you want change the sign of the vertical coordinates. Default FALSE
<code>eti</code>	selected row points for the graphic. Default all points
<code>axislabel</code>	if it is TRUE the axis information is written
<code>col.row</code>	color for row points and row labels. Default "black"
<code>cex</code>	global scale for the labels. Default <code>cex=0.8</code>
<code>cex.row</code>	scale for row points and row labels. Default <code>cex.row=0.8</code>
<code>all.point</code>	If it is TRUE, all points are outlined. Default <code>all.point=TRUE</code>
<code>cframe</code>	scale for graphic limits
<code>cex.global</code>	scale for the label sizes
<code>infaxes</code>	place to put the axes information: "out","in","no". Default <code>infaxes="out"</code> . If <code>infaxes="out"</code> the graphic is similar to FactoMineR graphics, otherwise the style is similar to the one in ade4, without axes information when <code>infaxes="no"</code>
<code>asp</code>	the y/x aspect ratio
<code>gg</code>	If TRUE the version ggplot ggrepel is performance. Default FALSE

**Details**

Plot the selected factorial plane.

**Value**

It graphs the factorial plane x,y using `co` and optional information of eigenvalues and representation quality of the points. If `ucal > 0`, only the points with the quality of representation on the plane bigger than `ucal` are pointed

**Author(s)**

Campo Elias Pardo <cepardot@unal.edu.co> and Jhonathan Medina <jmedinau@unal.edu.co>

**Examples**

```
data(Bogota)
ca <- dudi.coa(Bogota[,2:7],scannf=FALSE,nf=2)
# ade4 style
plotfp(ca$li,eig=ca$eig,main="First Factorial Plane",infxes="in")
# with ggplot2 and ggrepel
plotfp(ca$li,eig=ca$eig,main="First Factorial Plane",gg=TRUE)
```

---

plotpairs

*Modified pairs plot*

---

**Description**

Modified pairs plot: marginal kernel densities in diagonal, bivariate kernel densities in triangular superior; and scatter bivariate plots in triangular inferior

**Usage**

```
plotpairs(X,maxg=5,cex=1)
```

**Arguments**

X	matrix or data.frame of numeric columns
maxg	maximum number of variables to plot
cex	size of the points in dispersion diagrams

**Details**

Plot row profiles in horizontal form and columns profiles in vertical form

**Value**

The function does not return values

**Author(s)**

Campo Elias Pardo <cepardot@unal.edu.co>

**Examples**

```
data(iris)
plotpairs(iris[, -5])
```

---

`stableclus`*Stable clusters for cluster analysis*

---

**Description**

Performs Stable Cluster Algorithm for cluster analysis, using factorial coordinates from a `dudi` object

**Usage**

```
stableclus(dudi, part, k.clust, ff.clus=NULL, bplot=TRUE, kmns=FALSE)
```

**Arguments**

<code>dudi</code>	A <code>dudi</code> object, result of a previous factorial analysis using <code>ade4</code> or <code>FactoClass</code>
<code>part</code>	Number of partitions
<code>k.clust</code>	Number of clusters in each partition
<code>ff.clus</code>	Number of clusters for the final output, if <code>NULL</code> it asks in the console (Default <code>NULL</code> )
<code>bplot</code>	if <code>TRUE</code> , prints frequencies barplot of each cluster in the product partition (Default <code>TRUE</code> )
<code>kmns</code>	if <code>TRUE</code> , the process of consolidating the classification is performed (Default <code>FALSE</code> )

**Details**

Diday (1972) (cited by Lebart et al. (2006)) presented a method for cluster analysis in an attempt to solve one of the inconvenients with the *kmeans* algorithm, which is convergence to local optims. Stable clusters are built by performing different partitions (using `kmeansW` algorithmn), each one with different initial points. The groups are then formed by selecting the individuals belonging to the same cluster in every partion.

**Value**

object of class `stableclus` with the following characteristics:

`cluster`            vector indicating the cluster of each element.

...

**Author(s)**

Carlos Andres Arias <caarias@unal.edu.co>, Campo Elias Pardo <cepardot@unal.edu.co>

## References

Arias, C. A.; Zarate, D.C. and Pardo C.E. (2009), 'Implementacion del metodo de grupos estables en el paquete FactoClass de R', in: XIX Simposio Colombiano de Estadistica. Estadisticas Oficiales Medellin Colombia, Julio 16 al 20 de 2009 Universidad Nacional de Colombia. Bogota.

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Lebart, L., Morineau, A., Lambert, T. and Pleuvret, P. (1999), *SPAD. Syst?me Pour L'Analyse des Don?es*, Paris.

Lebart, L., Piron, M. and Morineau, A. (2006), *Statistique exploratoire multidimensionnelle. Visualisation et inference en fouilles de donnees*, 4 edn, Dunod, Paris.

## Examples

```
data(ColorAdjective)
FCcol <-FactoClass(ColorAdjective, dudi.coa,nf=6,nfcl=10,k.clust=7,scanFC = FALSE)
acs <- FCcol$dudi
# stableclus(acs,3,3,4,TRUE,TRUE)
```

---

supqual

*Projection of Qualitative Variables in PCA and MCA*

---

## Description

It returns the coordinates and aids to the interpretation when one or more qualitative variables are projected as illustrative in PCA or MCA

## Usage

```
supqual(du, qual)
```

## Arguments

du	a object of class "pca" or "acm" ("dudi") obtained with <code>dudi.pca</code> or <code>dudi.acm</code> of package <code>ade4</code>
qual	a <code>data.frame</code> of qualitative variables as factors

## Value

object of class `list` with the following:

wcat	weight of the categories in PCA case
ncat	frequency of the categories in MCA case
dis2	square distance to the origin from the complete space

coor	factorial coordinates
tv	test values
cos2	square cosinus
scr	relation of correaltion

**Author(s)**

Campo Elias Pardo <cepardot@unal.edu.co>

**Examples**

```
# in PCA
data(admi)
Y<-admi[,2:6]
pcaY<-dudi.pca(Y,scannf=FALSE)
Yqual<-admi[,c(1,8)]
supqual(pcaY,Yqual)
# in MCA
Y<-admi[,c(8,11,9,10)]
mcaY<-dudi.acm(Y,scannf=FALSE)
supqual(mcaY,admi[,c(1,13)])
```

---

Vietnam

*Student opinions about the Vietnam War*

---

**Description**

The newspaper of the students of the University of Chapel Hill (North Carolina) conducted a survey of student opinions about the Vietnam War in May 1967. Responses were classified by sex, year in the program and one of four opinions:

- A** defeat power of North Vietnam by widespread bombing and land invasion
- B** follow the present policy
- C** withdraw troops to strong points and open negotiations on elections involving the Viet Cong
- D** immediate withdrawal of all U.S. troops

**Usage**

```
data(Vietnam)
```

**Format**

The 3147 consulted students were classified considering the sex, year of study and chosen strategy, originating a contingency table of 10 rows: M1 to M5 and F1 to F5 (the years of education are from 1 to 5 and sexes are male (M) and female (F)) and 4 columns A, B, C and D.

**Source**

Fine, J. (1996), 'Iniciacion a los analisis de datos multidimensionales a partir de ejemplos', Notes of course, Montevideo

---

ward.cluster

*Hierarchic Classification by Ward's Method*


---

**Description**

Performs the classification by Ward's method from the matrix of Euclidean distances.

**Usage**

```
ward.cluster(dista, peso = NULL , plots = TRUE, h.clust = 2, n.indi = 25 )
```

**Arguments**

dista	matrix of Euclidean distances ( class(dista)=="dist" ).
peso	(Optional) weight of the individuals, by default equal weights
plots	it makes dendrogram and histogram of the Ward's method
h.clust	if it is '0' returns a object of class hclust and a table of level indices, if it is '1' returns a object of class hclust, if it is '2' returns a table of level indices.
n.indi	number of indices to draw in the histogram (default 25).

**Details**

It is an entrance to the function h.clus to obtain the results of the procedure presented in Lebart et al. (1995). Initially the matrix of distances of Ward of the elements to classify is calculated:

The Ward's distance between two elements to classify  $i$  and  $l$  is given by:

$$W(i, l) = (m_i * m_l) / (m_i + m_l) * dist(i, l)^2$$

where  $m_i$  y  $m_l$  are the weights and  $dist(i, l)$  is the Euclidean distance between them.

**Value**

It returns an object of class hclust and a table of level indices (depending of h.clust). If plots = TRUE it draws the indices of level and the dendrogram.

**Author(s)**

Pedro Cesar del Campo <pcdelcampon@unal.edu.co>, Campo Elias Pardo <cepardot@unal.edu.co>

**References**

Lebart, L. and Morineau, A. and Piron, M. (1995) *Statistique exploratoire multidimensionnelle*, Paris.

**Examples**

```
data(ardeche)
ca <- dudi.coa(ardeche$tab,scannf=FALSE,nf=4)

ward.cluster( dista= dist(ca$li), peso=ca$lw )

dev.new()
HW <- ward.cluster( dista= dist(ca$li), peso=ca$lw ,h.clust = 1)
plot(HW)
rect.hclust(HW, k=4, border="red")
```

---

Whisky

*Whisky example*

---

**Description**

Data frame with five features of 35 whisky brands:

**price** in France Francs

**malt** proportion in percentage

**type** by malt proportion: low, medium, pure

**aging** in years

**taste** mean score of a taste panel

**Usage**

```
data(Whisky)
```

**Source**

Fine, J. (1996), 'Iniciacion a los analisis de datos multidimensionales a partir de ejemplos', Notes of course, Montevideo



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