

# Package ‘MFAg’

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**Type** Package

**Title** Multiple Factor Analysis (MFA)

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**Description** Performs Multiple Factor Analysis method for quantitative, categorical, frequency and mixed data, in addition to generating a lot of graphics, also has other useful functions.

**License** GPL (>= 2)

**NeedsCompilation** no

**Repository** CRAN

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DataMix

*Mixed data set.*

---

**Description**

Simulated set of mixed data on consumption of coffee.

**Usage**

```
data(DataMix)
```

**Format**

Data set with 10 rows and 7 columns. Being 10 observations described by 7 variables: Cooperatives/Tasters, Average grades given to analyzed coffees, Years of work as a taster, Taster with technical training, Taster exclusively dedicated, Average frequency of the coffees Classified as special, Average frequency of the coffees as commercial.

**Author(s)**

Paulo Cesar Ossani

Marcelo Angelo Cirillo

**Examples**

```
data(DataMix)  
DataMix
```

---

DataQuali

*Qualitative data set*

---

**Description**

Set simulated of qualitative data on consumption of coffee.

**Usage**

```
data(DataQuali)
```

**Format**

Data set simulated with 12 rows and 6 columns. Being 12 observations described by 6 variables: Sex, Age, Smoker, Marital status, Sportsman, Study.

**Author(s)**

Paulo Cesar Ossani

Marcelo Angelo Cirillo

**Examples**

```
data(DataQuali)
DataQuali
```

---

DataQuan

*Quantitative data set*

---

**Description**

Set simulated of quantitative data on grades given to some sensory characteristics of coffees.

**Usage**

```
data(DataQuan)
```

**Format**

Data set with 6 rows and 11 columns. Being 6 observations described by 11 variables: Coffee, Chocolate, Caramelised, Ripe, Sweet, Delicate, Nutty, Caramelised, Chocolate, Spicy, Caramelised.

**Author(s)**

Paulo Cesar Ossani

Marcelo Angelo Cirillo

**Examples**

```
data(DataQuan)
DataQuan
```

---

GSVD

*Generalized Singular Value Decomposition (GSVD).*

---

### Description

Given the matrix  $A$  of order  $n \times m$ , the generalized singular value decomposition (GSVD) involves the use of two sets of positive square matrices of order  $n \times n$  and  $m \times m$  respectively. These two matrices express constraints imposed, respectively, on the lines and columns of  $A$ .

### Usage

```
GSVD(data, plin = NULL, pcol = NULL)
```

### Arguments

<code>data</code>	Matrix used for decomposition.
<code>plin</code>	Weight for rows.
<code>pcol</code>	Weight for columns

### Details

If `plin` or `pcol` is not used, it will be calculated as the usual singular value decomposition.

### Value

<code>d</code>	Eigenvalues, that is, line vector with singular values of the decomposition.
<code>u</code>	Eigenvectors referring rows.
<code>v</code>	Eigenvectors referring columns.

### Author(s)

Paulo Cesar Ossani  
Marcelo Angelo Cirillo

### References

ABDI, H. Singular Value Decomposition (SVD) and Generalized Singular Value Decomposition (GSVD). In: SALKIND, N. J. (Ed.). *Encyclopedia of measurement and statistics*. Thousand Oaks: Sage, 2007. p. 907-912.

**Examples**

```
M = matrix(c(1,2,3,4,5,6,7,8,9,10,11,12), nrow = 4, ncol = 3)

svd(M) # Usual Singular Value Decomposition

GSVD(M) # GSVD with the same previous results

# GSVD with weights for rows and columns
GSVD(M, plin = c(0.1,0.5,2,1.5), pcol = c(1.3,2,0.8))
```

---

IM	<i>Indicator matrix.</i>
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**Description**

In the indicator matrix the elements are arranged in the form of *dummy* variables, in other words, 1 for a category chosen as a response variable and 0 for the other categories of the same variable.

**Usage**

```
IM(data, names = TRUE)
```

**Arguments**

data	Categorical data.
names	Include the names of the variables in the levels of the Indicator Matrix (default = TRUE).

**Value**

mtxIndc	Returns converted data in the indicator matrix.
---------	---

**Author(s)**

Paulo Cesar Ossani  
Marcelo Angelo Cirillo

**References**

RENCHE, A. C. *Methods of multivariate analysis*. 2th. ed. New York: J.Wiley, 2002. 708 p.

**Examples**

```
data <- matrix(c("S","S","N","N",1,2,3,4,"N","S","T","N"), nrow = 4, ncol = 3)

IM(data, names = FALSE)

data(DataQuali) # qualitative data set

IM(DataQuali, names = TRUE)
```

---

LocLab

---

*Function for better position of the labels in the graphs.*


---

### Description

Function for better position of the labels in the graphs.

### Usage

```
LocLab(x, y = NULL, labels = seq(along = x), cex = 1,
       method = c("SANN", "GA"), allowSmallOverlap = FALSE,
       trace = FALSE, shadotext = FALSE,
       doPlot = TRUE, ...)
```

### Arguments

x	Coordinate x
y	Coordinate y
labels	The labels
cex	cex
method	Not used
allowSmallOverlap	Boolean
trace	Boolean
shadotext	Boolean
doPlot	Boolean
...	Other arguments passed to or from other methods

### Value

See the text of the function.

---

MFA

---

*Multiple Factor Analysis (MFA).*


---

### Description

Perform Multiple Factor Analysis (MFA) on groups of variables. The groups of variables can be quantitative, qualitative, frequency (MFACT) data, or mixed data.

### Usage

```
MFA(data, groups, typegroups = rep("n",length(groups)), namegroups = NULL)
```

**Arguments**

data	Data to be analyzed.
groups	Number of columns for each group in order following the order of data in 'data'.
typegroups	Type of group: "n" for numerical data (default), "c" for categorical data, "f" for frequency data.
namegroups	Names for each group.

**Value**

vtrG	Vector with the sizes of each group.
vtrNG	Vector with the names of each group.
vtrplin	Vector with the values used to balance the lines of the Z matrix.
vtrpcol	Vector with the values used to balance the columns of the Z matrix.
mtxZ	Matrix concatenated and balanced.
mtxA	Matrix of the eigenvalues (variances) with the proportions and proportions accumulated.
mtxU	Matrix U of the singular decomposition of the matrix Z.
mtxV	Matrix V of the singular decomposition of the matrix Z.
mtxF	Matrix global factor scores where the lines are the observations and the columns the components.
mtxEFG	Matrix of the factor scores by group.
mtxCCP	Matrix of the correlation of the principal components with original variables.
mtxEV	Matrix of the partial inertias / scores of the variables

**Author(s)**

Paulo Cesar Ossani  
Marcelo Angelo Cirillo

**References**

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## See Also

[Plot.MFA](#)

## Examples

```
data(DataMix) # mixed dataset

data <- DataMix[,2:ncol(DataMix)]

rownames(data) <- DataMix[1:nrow(DataMix),1]
```



```
GroupNames = c("Grade Cafes/Work", "Formation/Dedication", "Coffees")

MF <- MFA(data = data, c(2,2,2), typegroups = c("n","c","f"), GroupNames) # performs MFA

print("Principal Component Variances:"); round(MF$mtxA,2)

print("Matrix of the Partial Inertia / Score of the Variables:"); round(MF$mtxEV,2)
```

---

MFAg

*Multiple Factor Analysis (MFA)*

---

## Description

Performs multiple factor analysis method for quantitative, categorical, frequency and mixed data.

## Details

Package:	MFAg
Type:	Package
Version:	1.7
Date:	2020-05-21
License:	GPL (>=2)
LazyLoad:	yes

## Author(s)

Paulo Cesar Ossani,  
Marcelo Angelo Cirillo  
Maintainer: Paulo Cesar Ossani <ossanipc@hotmail.com>

## References

ABDESSEMED, L. and ESCOFIER, B.; Analyse factorielle multiple de tableaux de frequences: comparaison avec l'analyse canonique des correspondences. *Journal de la Societe de Statistique de Paris*, Paris, v. 137, n. 2, p. 3-18, 1996.

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---

NormData	<i>Normalizes the data.</i>
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---

## Description

Function that normalizes the data globally, or by column.

## Usage

```
NormData(data, type = 1)
```

## Arguments

data	Data to be analyzed.
type	1 normalizes overall (default), 2 normalizes per column.

## Value

dataNorm	Normalized data.
----------	------------------

## Author(s)

Paulo Cesar Ossani  
Marcelo Angelo Cirillo

## Examples

```
data(DataQuan) # set of quantitative data

data <- DataQuan[,2:8]

Resp = NormData(data, type = 1) # normalizes the data globally

Resp # Globally standardized data

sd(Resp) # overall standard deviation

mean(Resp) # overall mean

Resp = NormData(data, type = 2) # normalizes the data per column
```

```

Resp # standardized data per column

apply(Resp, 2, sd) # standard deviation per column

colMeans(Resp)    # column averages

```

---

Plot.MFA

*Graphics of the Multiple Factor Analysis (MFA).*


---

### Description

Graphics of the Multiple Factor Analysis (MFA).

### Usage

```

Plot.MFA(MFA, titles = NA, xlabel = NA, ylabel = NA,
         posleg = 2, boxleg = TRUE, size = 1.1, grid = TRUE,
         color = TRUE, groupscolor = NA, namarr = FALSE,
         linlab = NA, casc = TRUE)

```

### Arguments

MFA	Data of the MFA function.
titles	Titles of the graphics, if not set, assumes the default text.
xlabel	Names the X axis, if not set, assumes the default text.
ylabel	Names the Y axis, if not set, assumes the default text.
posleg	1 for caption in the left upper corner, 2 for caption in the right upper corner (default), 3 for caption in the right lower corner, 4 for caption in the left lower corner.
boxleg	Puts frame in legend (default = TRUE).
size	Size of the points in the graphs.
grid	Put grid on graphs (default = TRUE).
color	Colored graphics (default = TRUE).
groupscolor	Vector with the colors of the groups.
namarr	Puts the points names in the cloud around the centroid in the graph corresponding to the global analysis of the Individuals and Variables (default = FALSE).
linlab	Vector with the labels for the observations, if not set, assumes the default text.
casc	Cascade effect in the presentation of the graphics (default = TRUE).

### Value

Returns several graphs.

**Author(s)**

Paulo Cesar Ossani  
Marcelo Angelo Cirillo

**See Also**

[MFA](#)

**Examples**

```
data(DataMix) # set of mixed data

Data <- DataMix[,2:ncol(DataMix)]

rownames(Data) <- DataMix[1:nrow(DataMix),1]

GroupNames = c("Grade Cafes/Work", "Formation/Dedication", "Coffees")

MF <- MFA(Data, c(2,2,2), typegroups = c("n","c","f"), GroupNames) # performs MFA

Tit = c("Scree-Plot","Observations","Observations/Variables","Inertia of the Variable Groups")

Plot.MFA(MF, titles = Tit, xlabel = NA, ylabel = NA,
         posleg = 2, boxleg = FALSE, color = TRUE,
         groupcolor = c("blue3","red","goldenrod3"),
         namarr = FALSE, linlab = NA,
         casc = FALSE) # plotting several graphs on the screen

Plot.MFA(MF, titles = Tit, xlabel = NA, ylabel = NA,
         posleg = 2, boxleg = FALSE, color = TRUE,
         namarr = FALSE, linlab = rep("A?",10),
         casc = FALSE) # plotting several graphs on the screen
```

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