

Package ‘Routliers’

May 23, 2019

Title Robust Outliers Detection

Version 0.0.0.3

Description Detecting outliers using robust methods,
i.e. the Median Absolute Deviation (MAD) for univariate out-
liers; Leys, Ley, Klein, Bernard, & Licata (2013) <doi:10.1016/j.jesp.2013.03.013>
and the Mahalanobis-Minimum Covariance Determinant (MMCD) for multivariate out-
liers; Leys, C., Klein, O., Dominicy, Y. & Ley, C. (2018) <doi:10.1016/j.jesp.2017.09.011>.
There is also the more known but less robust Mahalanobis distance method, only for compari-
son purposes.

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Encoding UTF-8

LazyData true

RoxygenNote 6.1.1

Depends R (>= 2.10)

BugReports <https://github.com/mdelacre/Routliers/issues>

Suggests knitr, rmarkdown, testthat

Imports MASS, stats, graphics, ggplot2

NeedsCompilation no

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Repository CRAN

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Attacks	<i>Data collected the day after the terrorist attacks in Brussels (on the morning of 22 March 2016) assessing the Sense of Coherence, anxiety and depression symptoms of 2077 subjects (1056 were in Brussels during the terrorist attacks, and 1021 were not).</i>
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Description

The Sense of Coherence was assessed with the SOC-13 (Antonovsky, 1987): 7-point Likert scale (13 items) Anxiety and depression were assessed with the HSCL-25 (Derogatis, Lipman, Rickels, Uhlenhuth & Covi, 1974). Subjects have to mention in a 4-point Likert Scale how much there were bothered or upset by each trouble during the last 14 days (1 = not at all; 2 = a little; quite a few; 4 = a lot).

Usage

```
data(Attacks)
```

Format

A data frame with 2077 rows and 46 variables:

age age of participants, in years

presencebxl were participants present in Brussels during the terrorist attacks; 1 = yes; -1 = no

genre participant gender, 1 = female; -1 = male

soc1 Vous avez le sentiment que vous ne vous souciez pas reellement de ce qui se passe autour de vous: 1 = Tres rarement ou rarement; 7 = Souvent

soc1r item1 reversed

soc2 Vous est-il arrive dans le passe d etre surpris(e) par le comportement de gens que vous pensiez connaitre tres bien ?: 1 = Jamais; 7 = Toujours

soc2r item2 reversed

soc3 Est-il arrive que des gens sur lesquels vous comptiez vous decoivent ?: 1= Jamais; 7 = Toujours

soc3r sense of coherence, item3 reversed

soc4 Jusqu a maintenant, votre vie : 1 = N a eu aucun but ni objectif clair; 7 = A eu des buts et des objectifs tres clairs

soc5 Avez-vous le sentiment que vous etes traite(e) injustement ?:1 = Tres souvent; 7 = Tres rarement ou jamais

- soc6** Avez-vous le sentiment que vous etes dans une situation inconnue et que vous ne savez pas quoi faire ?: 1 = Tres souvent; 7 = Tres rarement ou jamais
- soc7** Faire les choses que vous faites quotidiennement est : 1 = Une source de plaisir et de satisfaction; 7 = Une source de souffrance profonde et d ennui
- soc7r** item7 reversed
- soc8** Avez-vous des idees ou des sentiments confus(es) ?: 1 = Tres souvent; 7 = Tres rarement ou jamais
- soc9** Vous arrive-t-il d avoir des sentiments intimes que vous prefereriez ne pas avoir ?: 1 = Tres souvent; 7 = Tres rarement ou jamais
- soc10** Beaucoup de gens (meme s'ils ont beaucoup de caractere) se sentent parfois de pauvres cloches. Avez-vous deja eu ce sentiment dans le passe ?: 1 = Jamais; 7 = Tres souvent
- soc10r** item10 reversed
- soc11** Quand quelque chose arrive, vous trouvez generalement que : 1 = Vous surestimez ou sous-estimez son importance; 7 = Vous voyez les choses dans de justes proportions
- soc12** Avez-vous le sentiment que les choses que vous faites dans la vie quotidienne ont peu de sens ?: 1 = Tres souvent; 7 = Tres rarement ou jamais
- soc13** Vous avez le sentiment que vous n etes pas sur(e) de vous maitriser : 1 = Tres souvent; 7 = Tres rarement ou jamais
- hsc1** Mal de tete
- hsc2** Tremblement
- hsc3** Fatigue ou etourdissement
- hsc4** Nervosite, agitation au fond de soi
- hsc5** Peur soudaine sans raison particuliere
- hsc6** Continuellement peureux ou anxieux
- hsc7** Battements du coeur qui s'emballent
- hsc8** Sensation d etre tendu, stresse
- hsc9** Crise d angoisse ou de panique
- hsc10** Tellement agite qu'il en est difficile de rester assis
- hsc11** Manque d energie, tout va plus lentement que d habitude
- hsc12** Se fait facilement des reproches
- hsc13** Pleure facilement
- hsc14** Pense a se tuer
- hsc15** Mauvais appetit
- hsc16** Probleme de sommeil
- hsc17** Sentiment de desesperoir en pensant au futur
- hsc18** Decouragement, morose
- hsc19** Sentiment de solitude
- hsc20** Perte d interets et d envies sexuelles
- hsc21** Sentiment de s etre fait prendre au piège ou fait prisonnier
- hsc22** Agite ou se tracasse beaucoup
- hsc23** Aucun interet pour quoique ce soit
- hsc24** Sentiment que tout est fatiguant
- hsc25** Sentiment d etre inutile

Details

In french

Intention	<i>Study five of Rogers, T. & Milkman, K. L. (2016). Reminders through association. Psychological Science, 27, 973-986.</i>
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Description

Participants have to answer to many questions (in a 11-page-survey). For 5 questions (indicated by \$\$ at the beginning of the question), they are told that there is a correct answer and that they will earn \$0.06 if they provide this correct answer. At the beginning of the experiment, there are also told that they will earn a \$0.60 bonus if they choose the answer E on the last question (whatever this is the correct answer or not).

Usage

data(Intention)

Format**age** age**choice** Did participants choose to have a reminder? (1 = yes; 0 = no). Note that in conditions 2 and 4, participants had no choices and therefore, 0 is coded for all subjects in these two conditions**Condition** Condition 1 = free-reminder-through-association condition: participants read that they can choose to have (for free) an image of an elephant (presented on screen) that would appear at the bottom of page 11 as a reminder of selecting answer E; Condition 2 = non condition: no reminders; Condition 3 = costly-reminder-through-association condition: participants read that if they pay \$0.03, an image of an elephant (presented on screen) would appear at the bottom of page 11 as a reminder of selecting answer E Condition 4 = forced-reminder-through-association condition: participants read that an image of an elephant (presented on screen) would appear at the bottom of page 11 as a reminder of selecting answer E.**correct** Did participants earn \$0.60 bonus? (1 = yes; 0 = no)**dup** No available information**fee_for_reminder** How much was paid for a reminder? (\$0.00 or \$0.03)**filter_.** No available information**final_problem** Earned money for answering E on the last question: \$0.00 (if E was not selected) or \$0.60 (if E was selected)**gender** Gender; 0 = male; 1 = female**id** participants id**plus** Earned money at the beginning (\$0.06 for all participants)**problem1** First question for which participants earn a \$0.03 bonus if they provide the correct answer

problem2 Second question for which participants earn a \$0.03 bonus if they provide the correct answer

problem3 Third question for which participants earn a \$0.03 bonus if they provide the correct answer

problem4 Fourth question for which participants earn a \$0.03 bonus if they provide the correct answer

problem5 Fifth question for which participants earn a \$0.03 bonus if they provide the correct answer

Total_Amount_Earned $\text{Intention}_{\text{final_problem}}$ minus $\text{Intention}_{\text{fee_for_reminder}}$; They are 4 possible outcomes: (1) \$-0.03, if a reminder was paid and answer E was not selected on the last question; (2) \$0.00, if no reminder was paid and answer E was not selected on the last question; (3) \$0.57, if a reminder was paid and answer E was selected on the last question; (4) \$0.60, if no reminder was paid and answer E was selected on the last question

Total_Amount_Earned_if.forced.to.pay.for.cue equals $\text{Intention}_{\text{Total_Amount_Earned}}$ in all but one condition: in condition 1 (free-reminder-through-association condition): $\text{Intention}_{\text{Total_Amount_Earned_if.forced}}$ $\text{Intention}_{\text{Total_Amount_Earned}} - 0.03$

Morality

Replication of Experiments Evaluating Impact of Psychological Distance on Moral Judgment (Eyal, Liberman & Trope, 2008; Gong & Medin, 2012) Study 2

Description

For 6 scenarios, participants have to evaluate the wrongness of actions, with a scale ranging from 1 (not ok) to 5 (completely ok) Contributors: Biljana Jokic Iris Zvezelj osf link: <https://osf.io/8wqvc/>

Usage

```
data(Morality)
```

Format

a data frame with 145 rows and 10 columns

number participant id

Orig_rep Is participant English or Serbian?

social_distance Is the person in the scenario someone participants know (i.e. colleague, neighbor)?

swing_r A girl pushing another kid off a swing because she really wants to use it before going home

flag_r A woman cutting it up a national flag into small pieces and using it in order to clean her house

hands_r A man eating his food with his hands, like most of his family members, also in public, after he washes them

mother_r A loving man who promised her dying mother that he would visit her grave every week but didn't keep his promise because he was very busy

kiss_r Two cousins kissing each other passionately on the mouth, in secret, because there are in love

dog_r Eating our dog that was bitten by a car in front of our house and was killed

mean_judge_r average of all scenarios judgment

outliers_mad *MAD function to detect outliers*

Description

Detecting univariate outliers using the robust median absolute deviation

Usage

```
outliers_mad(x, b, threshold, na.rm)
```

Arguments

x	vector of values from which we want to compute outliers
b	constant depending on the assumed distribution underlying the data, that equals $1/Q(0.75)$. When the normal distribution is assumed, the constant 1.4826 is used (and it makes the MAD and SD of normal distributions comparable).
threshold	the number of MAD considered as a threshold to consider a value an outlier
na.rm	set whether Missing Values should be excluded (na.rm = TRUE) or not (na.rm = FALSE) - defaults to TRUE

Value

Returns Call, median, MAD, limits of acceptable range of values, number of outliers

Examples

```
#### Run outliers_mad
x <- runif(150,-100,100)
outliers_mad(x, b = 1.4826,threshold = 3,na.rm = TRUE)

#### Results can be stored in an object.
data(Intention)
res1=outliers_mad(Intention$age)
# Moreover, a list of elements can be extracted from the function,
# such as all the extremely high values,
# That will be sorted in ascending order
#### The function should be performed on dimension rather than on isolated items
data(Attacks)
```

```
SOC <- rowMeans(Attacks[,c("soc1r","soc2r","soc3r","soc4","soc5","soc6",
"soc7r","soc8","soc9","soc10r","soc11","soc12","soc13")])
res=outliers_mad(x = SOC)
```

outliers_mahalanobis *mahalanobis function to detect outliers*

Description

Detecting multivariate outliers using the Mahalanobis distance

Usage

```
outliers_mahalanobis(x, alpha, na.rm)
```

Arguments

x	matrix of bivariate values from which we want to compute outliers
alpha	nominal type I error probability (by default .01)
na.rm	set whether Missing Values should be excluded (na.rm = TRUE) or not (na.rm = FALSE) - defaults to TRUE

Value

Returns Call, Max distance, number of outliers

Examples

```
#### Run outliers_mahalanobis
data(Attacks)
SOC <- rowMeans(Attacks[,c("soc1r","soc2r","soc3r","soc4","soc5","soc6","soc7r",
"soc8","soc9","soc10r","soc11","soc12","soc13")])
HSC <- rowMeans(Attacks[,22:46])
res <- outliers_mahalanobis(x = cbind(SOC,HSC), na.rm = TRUE)
# A list of elements can be extracted from the function,
# such as the position of outliers in the dataset
# and the coordinates of outliers
res$outliers_pos
res$outliers_val
```

outliers_mcd *MCD function to detect outliers*

Description

Detecting multivariate outliers using the Minimum Covariance Determinant approach

Usage

```
outliers_mcd(x, h, alpha, na.rm)
```

Arguments

x	matrix of bivariate values from which we want to compute outliers
h	proportion of dataset to use in order to compute sample means and covariances
alpha	nominal type I error probability (by default .01)
na.rm	set whether Missing Values should be excluded (na.rm = TRUE) or not (na.rm = FALSE) - defaults to TRUE

Value

Returns Call, Max distance, number of outliers

Examples

```
#### Run outliers_mcd
# The default is to use 75% of the datasets in order to compute sample means and covariances
# This proportion equals 1-breakdown points (i.e. h = .75 <--> breakdown points = .25)
# This breakdown points is encouraged by Leys et al. (2018)
data(Attacks)
SOC <- rowMeans(Attacks[,c("soc1r", "soc2r", "soc3r", "soc4", "soc5", "soc6", "soc7r",
"soc8", "soc9", "soc10r", "soc11", "soc12", "soc13")])
HSC <- rowMeans(Attacks[,22:46])
res <- outliers_mcd(x = cbind(SOC,HSC), h = .75)
res

# Moreover, a list of elements can be extracted from the function,
# such as the position of outliers in the dataset
# and the coordinates of outliers
res$outliers_pos
res$outliers_val
```

plot_outliers_mad *Plotting function for the mad*

Description

plotting data and highlighting univariate outliers detected with the outliers_mad function

Usage

```
plot_outliers_mad(res, x, pos_display = FALSE)
```

Arguments

res	result of the outliers_mad function from which we want to create a plot
x	data from which the outliers_mad function was performed
pos_display	set whether the position of outliers in the dataset should be displayed on the graph (pos_display = TRUE) or not (pos_display = FALSE)

Value

None

Examples

```
#### Run outliers_mad and perform plot_outliers_mad on the result
data(Intention)
res=outliers_mad(Intention$age)
plot_outliers_mad(res,x=Intention$age)

### when the number of outliers is small, one can display the outliers position in the dataset
x=c(rnorm(10),3)
res2=outliers_mad(x)
plot_outliers_mad(res2,x,pos_display=TRUE)
```

plot_outliers_mahalanobis *Plotting function for the Mahalanobis distance approach*

Description

plotting data and highlighting multivariate outliers detected with the mahalanobis distance approach

Usage

```
plot_outliers_mahalanobis(res, x, pos_display = FALSE)
```

Arguments

res	result of the outliers_mad function from which we want to create a plot
x	matrix of multivariate values from which we want to compute outliers. Last column of the matrix is considered as the DV in the regression line.
pos_display	set whether the position of outliers in the dataset should be displayed on the graph (pos_display = TRUE) or not (pos_display = FALSE)

Details

plotting data and highlighting multivariate outliers detected with the MCD function. Additionally, the plot returns two regression lines: the first one including all data and the second one including all observations but the detected outliers. It allows to observe how much the influence of outliers on the regression line.

Value

None

Examples

```
#### Run plot_outliers_mahalanobis
data(Attacks)
SOC <- rowMeans(Attacks[,c("soc1r", "soc2r", "soc3r", "soc4", "soc5", "soc6",
"soc7r", "soc8", "soc9", "soc10r", "soc11", "soc12", "soc13")])
HSC <- rowMeans(Attacks[,22:46])
res <- outliers_mahalanobis(x = cbind(SOC,HSC))
plot_outliers_mahalanobis(res, x = cbind(SOC,HSC))
# it's also possible to display the position of the multivariate outliers on the graph
# preferably, when the number of multivariate outliers is not too high
c1 <- c(1,4,3,6,5,2,1,3,2,4,7,3,6,3,4,6)
c2 <- c(1,3,4,6,5,7,1,4,3,7,50,8,8,15,10,6)
res2 <- outliers_mahalanobis(x = cbind(c1,c2))
plot_outliers_mahalanobis(res2, x = cbind(c1,c2),pos_display = TRUE)

# When no outliers are detected, only one regression line is displayed
c3 <- c(1,4,3,6,5)
c4 <- c(1,3,4,6,5)
res3 <- outliers_mahalanobis(x = cbind(c3,c4))
plot_outliers_mahalanobis(res3,x = cbind(c3,c4))
```

Description

plotting data and highlighting multivariate outliers detected with the MCD function. Additionally, the plot returns two regression lines: the first one including all data and the second one including all observations but the detected outliers. It allows to observe how much the outliers influence of outliers on the regression line.

Usage

```
plot_outliers_mcd(res, x, pos_display = FALSE)
```

Arguments

res	result of the outliers_mcd function from which we want to create a plot
x	matrix of multivariate values from which we want to compute outliers. Last column of the matrix is considered as the DV in the regression line.
pos_display	set whether the position of outliers in the dataset should be displayed on the graph (pos_display = TRUE) or not (pos_display = FALSE)

Value

None

Examples

```
#### Run plot_outliers_mcd
data(Attacks)
SOC <- rowMeans(Attacks[,c("soc1r", "soc2r", "soc3r", "soc4", "soc5", "soc6",
"soc7r", "soc8", "soc9", "soc10r", "soc11", "soc12", "soc13")])
HSC <- rowMeans(Attacks[,22:46])
res <- outliers_mcd(x = cbind(SOC, HSC), na.rm=TRUE, h=.75)
plot_outliers_mcd(res, x = cbind(SOC, HSC))

# it's also possible to display the position of the multivariate outliers on the graph
# preferably, when the number of multivariate outliers is not too high
c1 <- c(1,4,3,6,5,2,1,3,2,4,7,3,6,3,4,6)
c2 <- c(1,3,4,6,5,7,1,4,3,7,50,8,8,15,10,6)
res2 <- outliers_mcd(x = cbind(c1, c2), na.rm=TRUE)
plot_outliers_mcd(res2, x=cbind(c1, c2), pos_display=TRUE)

# When no outliers are detected, only one regression line is displayed
c3 <- c(1,2,3,1,4,3,5,5)
c4 <- c(1,2,3,1,5,3,5,5)
res3 <- outliers_mcd(x = cbind(c3, c4), na.rm=TRUE)
plot_outliers_mcd(res3, x=cbind(c3, c4), pos_display=TRUE)
```

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