



roahd (version 1.4.3)

# outliergram: Outliergram for univariate functional data sets

## Description

This function performs the outliergram of a univariate functional data set, possibly with an adjustment of the true positive rate of outliers discovered under assumption of gaussianity.

## Usage

```
outliergram(  
  fData,  
  MBD_data = NULL,  
  MEI_data = NULL,  
  p_check = 0.05,  
  Fvalue = 1.5,  
  adjust = FALSE,  
  display = TRUE,  
  xlab = NULL,  
  ylab = NULL,  
  main = NULL,  
  ...  
)
```

## Arguments

<b>fData</b>	the univariate functional dataset whose outliergram has to be determined.
<b>MBD_data</b>	a vector containing the MBD for each element of the dataset. If missing, MBDs are computed.
<b>MEI_data</b>	a vector containing the MEI for each element of the dataset. If not not provided, MEIs are computed.
<b>p_check</b>	percentage of observations with either low or high MEI to be checked for outliers in the secondary step (shift towards the center of the dataset).
<b>Fvalue</b>	the $F$ value to be used in the procedure that finds the shape outliers by looking at the lower parabolic limit in the outliergram. Default is <code>`1.5`</code> . You can also leave the default value and, by providing the parameter <code>`adjust`</code> , specify that you want <code>`Fvalue`</code> to be adjusted for the dataset provided in <code>`fData`</code> .

## **adjust**

either ``FALSE`` if you would like the default value for the inflation factor,  $F = 1.5$ , to be used, or a list specifying the parameters required by the adjustment.

"``N_trials``": the number of repetitions of the adjustment procedure based on the simulation of a gaussian population of functional data, each one producing an adjusted value of  $F$ , which will lead to the averaged adjusted value  $\bar{F}$ . Default is 20;

"``trial_size``": the number of elements in the gaussian population of functional data that will be simulated at each repetition of the adjustment procedure. Default is ``5 * fData$N``;

"``TPR``": the True Positive Rate of outliers, i.e. the proportion of observations in a dataset without shape outliers that have to be considered outliers. Default is ``2 * pnorm( 4 * qnorm( 0.25 ) )``;

"``F_min``": the minimum value of  $F$ , defining the left boundary for the optimization problem aimed at finding, for a given dataset of simulated gaussian data associated to ``fData``, the optimal value of  $F$ . Default is 0.5;

"``F_max``": the maximum value of  $F$ , defining the right boundary for the optimization problem aimed at finding, for a given dataset of simulated gaussian data associated to ``fData``, the optimal value of  $F$ . Default is 20;

"``tol``": the tolerance to be used in the optimization problem aimed at finding, for a given dataset of simulated gaussian data associated to ``fData``, the optimal value of  $F$ . Default is ``1e-3``;

"``maxiter``": the maximum number of iterations to solve the optimization problem aimed at finding, for a given dataset of simulated gaussian data associated to ``fData``, the optimal value of  $F$ . Default is ``100``;

"``VERBOSE``": a parameter controlling the verbosity of the adjustment process;

## **display**

either a logical value indicating whether you want the outliergram to be displayed, or the number of the graphical device where you want the outliergram to be displayed.

## **xlab**

a list of two labels to use on the x axis when displaying the functional dataset and the outliergram

<b>ylab</b>	a list of two labels to use on the y axis when displaying the functional dataset and the outliergram;
<b>main</b>	a list of two titles to be used on the plot of the functional dataset and the outliergram;
<b>...</b>	additional graphical parameters to be used <i>only</i> in the plot of the functional dataset

## Value

Even when used graphically to plot the outliergram, the function returns a list containing:

- ``Fvalue``: the value of the parameter  $F$  used;
- ``d``: the vector of values of the parameter  $d$  for each observation (distance to the parabolic border of the outliergram);
- ``ID_outliers``: the vector of observations id corresponding to outliers.

## Adjustment

When the adjustment option is selected, the value of  $F$  is optimized for the univariate functional dataset provided with ``fData``. In practice, a number ``adjust$N_trials`` of times a synthetic population (of size ``adjust$trial_size`` with the same covariance (robustly estimated from data) and centerline as ``fData`` is simulated without outliers and each time an optimized value  $F_i$  is computed so that a given proportion (``adjust$TPR``) of observations is flagged as outliers. The final value of ``F`` for the outliergram is determined as an average of  $F_1, F_2, \dots, F_{N_{trials}}$ . At each time step the optimization problem is solved using ``stats::uniroot`` (Brent's method).

## References

Arribas-Gil, A., and Romo, J. (2014). Shape outlier detection and visualization for functional data: the outliergram, *Biostatistics*, 15(4), 603-619.

## See Also

``fData``, ``MEI``, ``MBD``, ``fbplot``

# Examples

```
# NOT RUN {
set.seed(1618)

N <- 200
P <- 200
N_extra <- 4

grid <- seq(0, 1, length.out = P)

Cov <- exp_cov_function(grid, alpha = 0.2, beta = 0.8)

Data <- generate_gauss_fdata(
  N = N,
  centerline = sin(4 * pi * grid),
  Cov = Cov
)

Data_extra <- array(0, dim = c(N_extra, P))

Data_extra[1, ] <- generate_gauss_fdata(
  N = 1,
  centerline = sin(4 * pi * grid + pi / 2),
  Cov = Cov
)

Data_extra[2, ] <- generate_gauss_fdata(
  N = 1,
  centerline = sin(4 * pi * grid - pi / 2),
  Cov = Cov
)

Data_extra[3, ] <- generate_gauss_fdata(
  N = 1,
  centerline = sin(4 * pi * grid + pi / 3),
  Cov = Cov
)

Data_extra[4, ] <- generate_gauss_fdata(
  N = 1,
  centerline = sin(4 * pi * grid - pi / 3),
  Cov = Cov
)
```

Run this code

```

Data <- rbind(Data, Data_extra)

fD <- fData(grid, Data)

# Outliergram with default Fvalue = 1.5
outliergram(fD, display = TRUE)

# Outliergram with Fvalue enforced to 2.5
outliergram(fD, Fvalue = 2.5, display = TRUE)

# }
# NOT RUN {
# Outliergram with estimated Fvalue to ensure TPR of 1%
outliergram(
  fData = fD,
  adjust = list(
    N_trials = 10,
    trial_size = 5 * nrow(Data),
    TPR = 0.01,
    VERBOSE = FALSE
  ),
  display = TRUE
)
# }
# NOT RUN {
# }

```

Run the code above in your browser using [DataLab](#)