# Functions Expost IOp

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Documentation for the R functions used to estimate expost IOp. They are defined to be used for the GEOM database.  $^1$ 

# 1 Libraries

Libraries are updated on the  $1^{st}$  June, 2023.

 $<sup>^1\</sup>mathrm{Note} :$  Some functions call a weights argument. If you do not want to use weights, use a vector of value 1.

Library	Resource
trtf	https://cran.r-project.org/web/packages/trtf/index.html
tram	https://cran.r-project.org/web/packages/tram/index.html
dineq	https://cran.r-project.org/web/packages/dineq/index.html
lattice	https://cran.r-project.org/web/packages/lattice/index.html
latticeExtra	https://cran.r-project.org/web/packages/latticeExtra/index.html
multcomp	https://cran.r-project.org/web/packages/multcomp/index.html
memisc	https://cran.r-project.org/web/packages/memisc/index.html
Matrix	https://cran.r-project.org/web/packages/Matrix/index.html
colorspace	https://cran.r-project.org/web/packages/colorspace/index.html
grid	https://cran.r-project.org/src/contrib/Archive/grid/
libcoin	https://cran.r-project.org/web/packages/libcoin/index.html
inum	https://cran.r-project.org/web/packages/inum/index.html
partykit	https://cran.r-project.org/web/packages/partykit/index.html
ATR	https://cran.r-project.org/web/packages/ATR/index.html
mlt	https://cran.r-project.org/web/packages/mlt/index.html
modi	https://cran.r-project.org/web/packages/modi/index.html
resample	https://cran.r-project.org/web/packages/resample/index.html
scales	https://cran.r-project.org/web/packages/scales/index.html
forcats	https://cran.r-project.org/web/packages/forcats/index.html
ggsankey	https://github.com/davidsjoberg/ggsankey
metan	https://cran.r-project.org/web/packages/metan/index.html
RColorBrewer	https://cran.r-project.org/web/packages/RColorBrewer/index.html
gtools	https://cran.r-project.org/web/packages/gtools/index.html

# 2 Code

## 2.1 Tune Trafotree

tune\_trafotree(data, model, folds = 5, minorder = 2, maxorder = 10, mindiff = 0.001, plot = TRUE)

- data: name of dataframe.
- model: formula, e.g., dependent independents.
- folds: number of folds for the cross-validation. Default value: 5.
- minorder: minimum order to search. Default value: 2.
- maxorder: maximum order to search. Default value: 10.
- mindiff: relative improvement in the out of sample log-likelihood to select the order. For instance, 0.01 means an improvement of 1%. Default value: 0.001.
- plot: if TRUE, get a plot of the tuning.

The function returns four objects:

- order: order tuned.
- loglik: log-likelihood of the order tuned.
- res: results generated in the tuning.
- plot: object containing the plot, if plot = TRUE.

#### 2.2 Get Trafotree

get\_trtree(data, model, dep, order = 5, maxd = Inf, mincri = 0.99, minbu = 50, centiles = 99, rel.ineq = TRUE, lenv = TRUE, share\_lenv = 0.1)

- data: name of dataframe.
- model: formula, e.g., dependent independents.
- dep: name of the dependent variable (with quotation marks, e.g., "income").
- order: order tuned for the Bernstein Polynomial. Default = 5.
- mincri: mincriterion (1-alpha) of each tree. Default value = 0.99.
- minbu: minbucket of each tree. Default value = 50.
- centiles: number of centiles to set tranches. Default = 99.
- rel.ineq: If TRUE, y\_tilde is delivered to be estimated with relative inequality. If FALSE, y\_tilde is delivered to be estimated with the variance.
- lenv: Estimate Lower Envelope. Default = TRUE.
- share\_lenv: Estimate Robust Lower Envelope with the bottom XX%. Default XX = 0.1 (10%).

The function returns six objects:

- trafodata: data frame containing variable "y\_tilde", the smoothed dependent variable. It also includes the original data and the intermediate variables used to estimate IOp.
- tree: transformation tree object, that can be used for plots, own predictions and any other task.
- qtl: quantiles used in the data.
- tr: matrix containing the interpolations of the Bernstein Polinomial, used to estimate IOp.
- eop: estimate of lower envelope (area).
- eopx: estimate of robust lower envelope (area).

Note: The function sets test type = "Bonferroni".

#### 2.3 Get Plot with nice nodes

plot(object, terminal\_panel = node\_dense(colordens = "E0112B")

- object: trafotree object.
- terminal\_panel: how terminal nodes should be shown. Default node\_dense, showing the densities of log incomes.
- $\bullet$  color dens: color used to fill the densities. Default: "E0112B", the corporative red color used by III/LSE.

### 2.4 Get Log Interpolations

get\_tr(data, dep, types, order = 5, centiles = 99, rel.ineq = TRUE, lenv = TRUE, share\_lenv = TRUE)

- data: name of dataframe.
- dep: name of the dependent variable (with quotation marks, e.g., "income").
- types: name of type variable (with quotation marks, e.g., "types").
- order: order of the Bernstein Polynomial. Default: 5.
- centiles: number of centiles to interpolate the distribution. Default value: 99.
- rel.ineq: If TRUE, y\_tilde is delivered to be estimated with relative inequality. If FALSE, y\_tilde is delivered to be estimated with the variance.
- lenv: Estimate Lower Envelope. Default = TRUE.
- share\_lenv: Estimate Robust Lower Envelope with the bottom XX%. Default XX = 0.1 (10%).

The function returns three objects:

- trafodata: dataset with all new variables from log interpolation.
- qtl: quantiles used in the data.
- tr: matrix containing the interpolations of the Bernstein Polinomial, used to estimate IOp.

## 2.5 Arrange colors for Plots

colplot(data, dep, types, grouping\_var)

- data: name of dataframe.
- dep: name of the dependent variable (with quotation marks, e.g., "income").
- types: name of type variable (with quotation marks, e.g., "types").
- grouping\_var: name of variable that groups colors (with quotation marks, e.g., "types").
- palette: palette of colours to be used in the plot

The function returns three objects:

- plot\_data : dataset that can be used to plot, with the modified variables and labels.
- col: vector of colors.
- n\_types: number of types.

#### 2.6 Plot ECDFs

plot\_ponytail(data, dep, group, fill, quart\_var, tr, nti, col, limit\_x, x\_lab = "", y\_lab = "", labs = "", legend\_pos = "", title = "")

- data: name of dataframe.
- dep: name of the dependent variable (with quotation marks, e.g., "income").
- group: name of grouping variable (with quotation marks, e.g., "types").
- fill: name of filling variable (with quotation marks, e.g., "types").
- quart\_var: object with quantiles.
- tr: object with tr matrix.
- nti: number of types.
- col: vector of colors.
- limit\_x: range of x axis.
- $\bullet\,$  x\_lab y\_lab labs: labels for x axis, y axis and other labels.
- legend\_pos: position of legend.
- title: title of the plot.

The function returns a plot with the ECDFs and the interpolations.

## 2.7 Plot Densities

plot\_mountain(data, dep, group, fill, col, limit\_x, x\_lab = "", y\_lab = "", labs = "", legend\_pos = "bottom", title = "")

- data: name of dataframe.
- dep: name of the dependent variable (with quotation marks, e.g., "income").
- group: name of grouping variable (with quotation marks, e.g., "types").
- fill: name of filling variable (with quotation marks, e.g., "types").
- col: vector of colors.
- limit\_x: range of x axis.
- x\_lab y\_lab labs: labels for x axis, y axis and other labels.
- legend\_pos: position of legend. Default: "bottom".
- title: title of the plot.

The function returns a plot with the density as a mixture of type-specific densities.