

Package ‘MSCMT’

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Description Three generalizations of the synthetic control method (which has already an implementation in package 'Synth') are implemented: first, 'MSCMT' allows for using multiple outcome variables, second, time series can be supplied as economic predictors, and third, a well-defined cross-validation approach can be used.

Much effort has been taken to make the implementation as stable as possible (including edge cases) without losing computational efficiency.

A detailed description of the main algorithms is given in Becker and Klößner (2018) <[doi:10.1016/j.ecosta.2017.08.002](https://doi.org/10.1016/j.ecosta.2017.08.002)>.

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R topics documented:

compare	2
did	3
ggplot.mscmt	4
improveSynth	8
listFromLong	9
MSCMT	11
mscmt	12
plot.mscmt	18
ppratio	19
print.mscmt	21
pvalue	22
Index	24

compare	<i>Compare MSCMT estimation results</i>
---------	---

Description

compare collects estimation results from `mscmt` for comparison purposes.

Usage

```
compare(..., auto.name.prefix = "")
```

Arguments

... Objects of class "mscmt" or (a) list(s) containing objects of class "mscmt".

auto.name.prefix A character string (default: "") internally used to facilitate automatic naming in nested lists of unnamed estimation results.

Details

compare collects (potentially many) estimation results from `mscmt` in a special object of class "mscmt", which includes a component "comparison" where the different estimation results are aggregated. This aggregated information is used by the `ggplot.mscmt` and `print.mscmt` methods to present summaries of the different results.

Value

An object of class "mscmt", which itself contains the individual estimation results as well as a component "comparison" with aggregated information.

did *Difference-in-difference estimator based on SCM*

Description

did calculates difference-in-difference estimators based on SCM.

Usage

```
did(
  x,
  what,
  range.pre,
  range.post,
  alternative = c("two.sided", "less", "greater"),
  exclude.ratio = Inf
)
```

Arguments

- | | |
|------------|---|
| x | An object of class "mscmt", usually obtained as the result of a call to function mscmt . |
| what | A character vector. Name of the variable to be considered. If missing, the (first) dependent variable will be used. |
| range.pre | <p>A vector of length 2 defining the range of the pre-treatment period with start and end time given as</p> <ul style="list-style-type: none"> • annual dates, if the format of start/end time is "dddd", e.g. "2016", • quarterly dates, if the format of start/end time is "ddddQd", e.g. "2016Q1", • monthly dates, if the format of start/end time is "dddd?dd" with "?" different from "W" (see below), e.g. "2016/03" or "2016-10", • weekly dates, if the format of start/end time is "ddddWdd", e.g. "2016W23", • daily dates, if the format of start/end time is "dddd-dd-dd", e.g. "2016-08-18", <p>corresponding to the format of the respective column of the times.dep argument of mscmt. If missing, the corresponding column of times.dep will be used.</p> |
| range.post | <p>A vector of length 2 defining the range of the post-treatment period with start and end time given as</p> <ul style="list-style-type: none"> • annual dates, if the format of start/end time is "dddd", e.g. "2016", • quarterly dates, if the format of start/end time is "ddddQd", e.g. "2016Q1", |

- monthly dates, if the format of start/end time is "dddd?dd" with "?" different from "W" (see below), e.g. "2016/03" or "2016-10",
- weekly dates, if the format of start/end time is "ddddWdd", e.g. "2016W23",
- daily dates, if the format of start/end time is "dddd-dd-dd", e.g. "2016-08-18",

corresponding to the format of the respective column of the `times.dep` argument of `mscmt`. Will be guessed if missing.

<code>alternative</code>	A character string giving the alternative of the test. Either "two.sided" (default), "less", or "greater".
<code>exclude.ratio</code>	A numerical scalar (default: Inf). When calculating the p-value, control units with an average pre-treatment gap of more than <code>exclude.ratio</code> times the average pre-treatment gap of the treated unit are excluded from the analysis.

Details

`did` calculates difference-in-difference estimators with corresponding p-values (if results of a placebo study are present) based on the Synthetic Control Method.

Value

A list with components `effect.size`, `average.pre` and `average.post`. If `x` contains the results of a placebo study, three components `p.value`, `rank`, and `excluded` (with the names of the excluded units) are included additionally.

Examples

```
## Not run:
## for an example, see the main package vignette:
vignette("WorkingWithMSCMT", package="MSCMT")

## End(Not run)
```

ggplot.mscmt

Plotting Results of mscmt with ggplot2

Description

`ggplot.mscmt` plots results of `mscmt` based on `ggplot`.

Usage

```
## S3 method for class 'mscmt'
ggplot(
  data,
  mapping = aes(),
  what,
  type = c("gaps", "comparison", "placebo.gaps", "placebo.data", "p.value"),
```

```

treatment.time,
zero.line = TRUE,
ylab,
xlab = "Date",
main,
col,
lty,
lwd,
legend = TRUE,
bw = FALSE,
date.format,
unit.name,
full.legend = TRUE,
include.smooth = FALSE,
include.mean = FALSE,
include.synth = FALSE,
draw.estwindow = TRUE,
what.set,
limits = NULL,
alpha = 1,
alpha.min = 0.1,
exclude.units = NULL,
exclude.ratio = Inf,
ratio.type = c("rmspe", "mspe"),
alternative = c("two.sided", "less", "greater"),
draw.points = TRUE,
control.name = "control units",
size = 1,
treated.name = "treated unit",
labels = c("actual data", "synthesized data"),
...,
environment = parent.frame()
)

```

Arguments

<code>data</code>	An object of class "msamt", usually obtained as the result of a call to function <code>msamt</code> .
<code>mapping</code>	An object necessary to match the definition of the <code>ggplot</code> generic (passed to <code>ggplot</code> as is). Defaults to <code>aes()</code> .
<code>what</code>	A character vector. Name(s) of the variables to be plotted. If missing, the (first) dependent variable will be used.
<code>type</code>	A character scalar denoting the type of the plot containing either "gaps", "comparison", "placebo.gaps", "placebo.data", or "p.value". Partial matching allowed, defaults to "placebo.gaps", if results of a placebo study are present, and to "gaps", else.
<code>treatment.time</code>	An optional scalar (numeric, character, or <code>Date</code>) giving the treatment time. If <code>treatment.time</code> is numeric, Jan 01 of that year will be used. If <code>treatment.time</code>

is a character string, it will be converted to a [Date](#) and must thus be in an unambiguous format. A vertical dotted line at the given point in time is included in the plot.

<code>zero.line</code>	A logical scalar. If TRUE (default), a horizontal dotted line (at zero level) is plotted for "gaps" and "placebo.gaps" plots.
<code>ylab</code>	Optional label for the y-axis, automatically generated if missing.
<code>xlab</code>	Optional label for the x-axis, defaults to "Date".
<code>main</code>	Optional main title for the plot, automatically generated if missing.
<code>col</code>	Optional character vector with length 1 (for gaps plots) or 2 (for all other plot types). For comparison plots, <code>col</code> contains the colours for the actual and synthesized data, for placebo.plots (with <code>full.legend==FALSE</code>), <code>col</code> contains the colours for the treated unit and the control units. Automatically generated if missing.
<code>lty</code>	Optional numerical vector with length 1 (for gaps plots) or 2 (for all other plot types). For comparison plots, <code>lty</code> contains the linetypes for the actual and synthesized data, for placebo.plots (with <code>full.legend==FALSE</code>), <code>col</code> contains the linetypes for the treated unit and the control units. Automatically generated if missing.
<code>lwd</code>	Optional numerical vector with length 1 (for gaps plots) or 2 (for all other plot types). For comparison plots, <code>lty</code> contains the linewidths for the actual and synthesized data, for placebo.plots (with <code>full.legend==FALSE</code>), <code>col</code> contains the linewidths for the treated unit and the control units. Automatically generated if missing.
<code>legend</code>	A logical scalar. If TRUE (default), a legend is included in the plot.
<code>bw</code>	A logical scalar. If FALSE (default), the automatically generated colours and line types are optimized for a colour plot, if TRUE, the automatic colours and line types are set for a black and white plot.
<code>date.format</code>	A character string giving the format for the tick labels of the x axis as documented in strptime . Defaults to "%b %y" or "%Y", depending on the granularity of the data.
<code>unit.name</code>	A character string with the title of the legend for comparison and placebo plots. Defaults to "Estimation" for comparison and "Unit" for placebo plots.
<code>full.legend</code>	A logical scalar. If TRUE (default), a full legend of all units (donors) is constructed. If FALSE, only the treated and the control units are distinguished.
<code>include.smooth</code>	A logical scalar. If TRUE, a geometric smoother based on the control units is added to placebo plots. Default: FALSE.
<code>include.mean</code>	A logical scalar. If TRUE, the arithmetic mean of all control units is added to placebo plots. Default: FALSE.
<code>include.synth</code>	A logical scalar. If TRUE, the synthesized data for the treated unit are added to plots of type "placebo.data". Defaults to FALSE.
<code>draw.estwindow</code>	A logical scalar. If TRUE (default), the time range containing all optimization periods is shaded in the corresponding plots.

<code>what.set</code>	An optional character string for a convenient selection of multiple variables. Accepted values are "dependents", "predictors", and "all", which collects all dependent, all predictor, or all variables of both types, respectively. Overrides parameter <code>what</code> (if the latter is present).
<code>limits</code>	An optional vector of length 2 giving the range of the plot or NULL. If <code>limits</code> is numeric, Jan 01 of the corresponding years will be used. If <code>limits</code> is of type character, both strings will be converted to Dates (via <code>as.Date</code>) and must thus be in an unambiguous format.
<code>alpha</code>	Either a numerical scalar, a numerical vector of length corresponding to the number of units, or the character string "auto". If <code>alpha</code> is a numerical scalar (default with value 1), a fixed value for the alpha channel (transparency) is included for all units in placebo plots. If <code>alpha</code> is numeric and has length corresponding to the number of units, these values are assigned as alpha channel to the individual units. If "auto", the alpha channel information is obtained from the <code>w</code> weights of the control units.
<code>alpha.min</code>	A numerical scalar (default: 0.1). If <code>alpha</code> is set to "auto", the individual alpha channel information for control unit <code>i</code> is set to $\text{alpha.min} + (1 - \text{alpha.min}) * w[i]$.
<code>exclude.units</code>	An optional (default: NULL) character vector with names for control units which shall be excluded from placebo plots and p-value calculations.
<code>exclude.ratio</code>	A numeric scalar (default: Inf). Control units with a pre-treatment (r)mspe of more than <code>exclude.ratio</code> times the pre-treatment (r)mspe of the treated unit are excluded from placebo plots and p-value calculations.
<code>ratio.type</code>	A character string. Either <code>rmspe</code> (default) or <code>mspe</code> . Selects whether root mean squared errors or mean squared errors are considered for the exclusion of control units (see <code>exclude.ratio</code>).
<code>alternative</code>	A character string giving the alternative of the test for plots of type "p.value". Either "two.sided" (default), "less", or "greater".
<code>draw.points</code>	A logical scalar. If TRUE (default), points are added to the line plots to enhance visibility.
<code>control.name</code>	A character string for the naming of the non-treated units in placebo plots. Defaults to "control units".
<code>size</code>	A numerical scalar (default: 1). If <code>draw.points</code> is TRUE (default), <code>size</code> specifies the size of the points.
<code>treated.name</code>	A character string giving the label for the treated unit. Defaults to "treated unit".
<code>labels</code>	A character vector of length 2 giving the labels for the actual and synthesized data. Defaults to <code>c("actual data", "synthesized data")</code> .
<code>...</code>	Necessary to match the definition of the "ggplot" generic (passed to <code>ggplot</code> as is).
<code>environment</code>	An object necessary to match the definition of the "ggplot" generic (passed to <code>ggplot</code> as is). Defaults to <code>parent.frame()</code> .

Details

A unified plot method for gaps plots, comparison of treated and synthetic values, as well as plots for placebo studies, based on `ggplot`. `ggplot.mscmt` is the preferred plot method and has more functionality than `plot.mscmt`.

Value

An object of class `ggplot`.

improveSynth

Check (and Improve) Results of Package Synth

Description

`improveSynth` checks the results of `synth` for feasibility and optimality and tries to find a better solution.

Usage

```
improveSynth(
  synth.out,
  dataprep.out,
  lb = 1e-08,
  tol = 1e-05,
  verbose = TRUE,
  seed = 1,
  ...
)
```

Arguments

<code>synth.out</code>	A result of <code>synth</code> from package 'Synth'.
<code>dataprep.out</code>	The input of function <code>synth</code> which led to <code>synth.out</code> .
<code>lb</code>	A numerical scalar (default: $1e-8$), corresponding to the lower bound for the outer optimization.
<code>tol</code>	A numerical scalar (default: $1e-5$). If the relative <i>and</i> absolute improvement of <code>loss.v</code> and <code>loss.w</code> , respectively, exceed <code>tol</code> , this is reported (if <code>verbose</code> is <code>TRUE</code>). Better optima are always looked for (independent of the value of <code>tol</code>).
<code>verbose</code>	A logical scalar. Should the output be verbose (defaults to <code>TRUE</code>).
<code>seed</code>	A numerical vector or <code>NULL</code> . See the corresponding documentation for <code>mscmt</code> . Defaults to 1 in order to provide reproducibility of the results.
<code>...</code>	Further arguments to <code>mscmt</code> . Supported arguments are <code>check.global</code> , <code>inner.optim</code> , <code>inner.opar</code> , <code>outer.optim</code> , and <code>outer.opar</code> .

Details

Performing SCM means solving a nested optimization problem. Depending on the validity of the results of the inner optimization, SCM may produce

- invalid or infeasible results, if the vector w of donor weights reported as the result of the inner optimization is in fact not optimal, ie. produces too large $loss.w$,
- suboptimal results, if the vector v of predictor weights reported as the result of the outer optimization is in fact not optimal (which may be caused by shortcomings of the inner optimization).

improveSynth first checks synth.out for feasibility and then tries to find a feasible and optimal solution by applying the optimization methods of package MSCMT to dataprep.out (with default settings, more flexibility will probably be added in a future release).

Value

An updated version of synth.out, where solution.v, solution.w, loss.v, and loss.w are replaced by the optimum obtained by package 'MSCMT' and all other components of synth.out are removed.

Examples

```
## Not run:
## example has been removed because package 'Synth' has been archived
## See vignette 'Checking and Improving Results of package Synth'
## for an example working with a cached copy

## End(Not run)
```

listFromLong	<i>Convert Long Format to List Format</i>
--------------	---

Description

listFromLong converts long to list format.

Usage

```
listFromLong(
  foo,
  unit.variable,
  time.variable,
  unit.names.variable = NULL,
  exclude.columns = NULL
)
```

Arguments

<code>foo</code>	A <code>data.frame</code> containing the data in "long" format.
<code>unit.variable</code>	Either a numeric scalar with the column number (in <code>foo</code>) containing the units or a character scalar with the corresponding column name in <code>foo</code> .
<code>time.variable</code>	Either a numeric scalar with the column number (in <code>foo</code>) containing the times or a character scalar with the corresponding column name in <code>foo</code> .
<code>unit.names.variable</code>	Optional. If not <code>NULL</code> , either a numeric scalar with the column number (in <code>foo</code>) containing the unit names or a character scalar with the corresponding column name in <code>foo</code> . Must match with the units defined by <code>unit.variable</code> (if not <code>NULL</code>).
<code>exclude.columns</code>	Optional (defaults to <code>NULL</code>). Numeric vector with column numbers of <code>foo</code> to be excluded from the conversion.

Details

`listFromLong` is a convenience function to convert long format (in a `data.frame`, as used by package 'Synth') to list format, where data is stored as a list of matrices.

Most parameter names are named after their equivalents in the `dataprep` function of package 'Synth'.

Value

A list of matrices with rows corresponding to the times and columns corresponding to the unit (or unit names, respectively) for all columns of `foo` which are neither excluded nor have a special role as time, unit, or unit names variable.

Examples

```
## Not run:
## example has been modified because package 'Synth' has been archived
## dataset 'basque' is now retrieved from archive
setwd(tempdir())
download.file("https://cran.r-project.org/src/contrib/Archive/Synth/Synth_1.1-6.tar.gz",
             destfile="Synth.tar.gz")
untar("Synth.tar.gz", files="Synth/data/basque.RData")
load("Synth/data/basque.RData")
Basque <- listFromLong(basque, unit.variable="regionno",
                      time.variable="year",
                      unit.names.variable="regionname")

names(Basque)
head(Basque$gdpcap)

## End(Not run)
```

Description

MSCMT implements the Multivariate Synthetic Control Method Using Time Series.

Details

MSCMT implements three generalizations of the synthetic control method (which has already an implementation in package 'Synth'):

1. it allows for using multiple outcome variables,
2. time series can be supplied as economic predictors,
3. a well-defined cross-validation approach can be used.

Much effort has been taken to make the implementation as stable as possible (including edge cases) without losing computational efficiency.

References

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- Becker M, Klößner S (2018). "Fast and Reliable Computation of Generalized Synthetic Controls." *Econometrics and Statistics*, **5**, 1–19. <https://doi.org/10.1016/j.ecosta.2017.08.002>.
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- Klößner S, Pfeifer G (2015). "Synthesizing Cash for Clunkers: Stabilizing the Car Market, Hurting the Environment." Verein für Socialpolitik/German Economic Association. <https://ideas.repec.org/p/zbw/vfsc15/113207.html>.

Examples

```
## Not run:  
## for examples, see the package vignettes:  
browseVignettes(package="MSCMT")  
  
## End(Not run)
```

mscmt

*Multivariate SCM Using Time Series***Description**

mscmt performs the Multivariate Synthetic Control Method Using Time Series.

Usage

```
mscmt(
  data,
  treatment.identifier = NULL,
  controls.identifier = NULL,
  times.dep = NULL,
  times.pred = NULL,
  agg.fns = NULL,
  placebo = FALSE,
  placebo.with.treated = FALSE,
  univariate = FALSE,
  univariate.with.dependent = FALSE,
  check.global = TRUE,
  inner.optim = "wnnlsOpt",
  inner.opar = list(),
  outer.optim = "DEoptC",
  outer.par = list(),
  outer.opar = list(),
  std.v = c("sum", "mean", "min", "max"),
  alpha = NULL,
  beta = NULL,
  gamma = NULL,
  return.ts = TRUE,
  single.v = FALSE,
  verbose = TRUE,
  debug = FALSE,
  seed = NULL,
  cl = NULL,
  times.pred.training = NULL,
  times.dep.validation = NULL,
  v.special = integer(),
  cv.alpha = 0,
  spec.search.treated = FALSE,
  spec.search.placebos = FALSE
)
```

Arguments

data Typically, a list of matrices with rows corresponding to times and columns corresponding to units for all relevant features (dependent as well as predictor vari-

ables, identified by the list elements' names). This might be the result of converting from a `data.frame` by using function `listFromLong`.

For convenience, `data` may alternatively be the result of function `dataprep` of package 'Synth'. In this case, the parameters `treatment.identifier`, `controls.identifier`, `times.dep`, `times.pred`, and `agg.fns` are ignored, as these input parameters are generated automatically from `data`. The parameters `univariate`, `alpha`, `beta`, and `gamma` are ignored by fixing them to their defaults. Using results of `dataprep` is experimental, because the automatic generation of input parameters may fail due to lack of information contained in results of `dataprep`.

`treatment.identifier`

A character scalar containing the name of the treated unit. Must be contained in the column names of the matrices in `data`.

`controls.identifier`

A character vector containing the names of at least two control units. Entries must be contained in the column names of the matrices in `data`.

`times.dep`

A matrix with two rows (containing start times in the first and end times in the second row) and one column for each dependent variable, where the column names must exactly match the names of the corresponding dependent variables. A sequence of dates with the given start and end times of

- annual dates, if the format of start/end time is "dddd", e.g. "2016",
- quarterly dates, if the format of start/end time is "ddddQd", e.g. "2016Q1",
- monthly dates, if the format of start/end time is "dddd?dd" with "?" different from "W" (see below), e.g. "2016/03" or "2016-10",
- weekly dates, if the format of start/end time is "ddddWdd", e.g. "2016W23",
- daily dates, if the format of start/end time is "dddd-dd-dd", e.g. "2016-08-18",

will be constructed; these dates are looked for in the row names of the respective matrices in `data`. In applications with cross-validation, `times.dep` belongs to the main period.

`times.pred`

A matrix with two rows (containing start times in the first and end times in the second row) and one column for each predictor variable, where the column names must exactly match the names of the corresponding predictor variables. A sequence of dates with the given start and end times of

- annual dates, if the format of start/end time is "dddd", e.g. "2016",
- quarterly dates, if the format of start/end time is "ddddQd", e.g. "2016Q1",
- monthly dates, if the format of start/end time is "dddd?dd" with "?" different from "W" (see below), e.g. "2016/03" or "2016-10",
- weekly dates, if the format of start/end time is "ddddWdd", e.g. "2016W23",
- daily dates, if the format of start/end time is "dddd-dd-dd", e.g. "2016-08-18",

will be constructed; these dates are looked for in the row names of the respective matrices in `data`. In applications with cross-validation, `times.pred` belongs to the main period.

<code>agg.fns</code>	Either NULL (default) or a character vector containing one name of an aggregation function for each predictor variable (i.e., each column of <code>times.pred</code>). The character string "id" may be used as a "no-op" aggregation. Each aggregation function must accept a numeric vector and return either a numeric scalar ("classical" MSCM) or a numeric vector (leading to MSCM*T* if length of vector is at least two).
<code>placebo</code>	A logical scalar. If TRUE, a placebo study is performed where, apart from the treated unit, each control unit is considered as treated unit in separate optimizations. Defaults to FALSE. Depending on the number of control units and the complexity of the problem, placebo studies may take a long time to finish.
<code>placebo.with.treated</code>	A logical scalar. If TRUE, the treated unit is included as control unit (for other treated units in placebo studies). Defaults to FALSE.
<code>univariate</code>	A logical scalar. If TRUE, a series of univariate SCMT optimizations is done (instead of one MSCMT optimization) even if there is more than one dependent variable. Defaults to FALSE.
<code>univariate.with.dependent</code>	A logical scalar. If TRUE (and if <code>univariate</code> is also TRUE), all dependent variables (contained in the column names of <code>times.dep</code>) apart from the current (real) dependent variable are included as predictors in the series of univariate SCMT optimizations. Defaults to FALSE.
<code>check.global</code>	A logical scalar. If TRUE (default), a check for the feasibility of the unrestricted outer optimum (where actually no restrictions are imposed by the predictor variables) is made before starting the actual optimization procedure.
<code>inner.optim</code>	A character scalar containing the name of the optimization method for the inner optimization. Defaults to "wnnlsOpt", which (currently) is the only supported implementation, because it outperforms all other inner optimizers we are aware of. "ipopOpt", which uses <code>ipop</code> has experimental support for benchmark purposes.
<code>inner.opar</code>	A list containing further parameters for the inner optimizer. Defaults to the empty list. (For "wnnlsOpt", there are no meaningful further parameters.)
<code>outer.optim</code>	A character vector containing the name(s) of the optimization method(s) for the outer optimization. Defaults to "DEoptC", which (currently) is the recommended global optimizer. The optimizers currently supported can be found in the documentation of parameter <code>outer.opar</code> , where the default control parameters for the various optimizers are listed. If <code>outer.optim</code> has length greater than 1, one optimization is invoked for each outer optimizer (and, potentially, each random seed, see below), and the best result is used.
<code>outer.par</code>	A list containing further parameters for the outer optimization procedure. Defaults to the empty list. Entries in this list may override the following hard-coded general defaults: <ul style="list-style-type: none"> • <code>lb=1e-8</code>, corresponding to the lower bound for the ratio of predictor weights, • <code>opt.separate=TRUE</code>, corresponding to an improved outer optimization where each predictor is treated as the (potentially) most important predictor (i.e. with maximal weight) in separate optimizations (one for each predictor), see [1].

`outer.opar` A list (or a list of lists, if `outer.optim` has length greater than 1) containing further parameters for the outer optimizer(s). Defaults to the empty list. Entries in this list may override the following hard-coded defaults for the individual optimizers, which are quite modest concerning the computing time. `dim` is a variable holding the problem dimension, typically the number of predictors minus one.

Optimizer	Package	Default parameters
DEoptC	MSCMT	<code>nG=500, nP=20*dim, waitgen=100, minimpr=1e-14, F=0.5, CR=0.9</code>
cma_es	cmaes	<code>maxit=2500</code>
crs	nloptr	<code>maxeval=2.5e4, xtol_rel=1e-14, population=20*dim, algorithm="NLOPT_GN_CR_S2_LM"</code>
DEopt	NMOF	<code>nG=100, nP=20*dim</code>
DEoptim	DEoptim	<code>nP=20*dim</code>
ga	GA	<code>maxiter=50, monitor=FALSE, popSize=20*dim</code>
genoud	rgenoud	<code>print.level=0, max.generations=70, solution.tolerance=1e-12, pop.size=20*dim, wait.generations=dim, boundary.enforcement=2, gradient.check=FALSE, MemoryMatrix=FALSE</code>
GenSA	GenSA	<code>max.call=1e7, max.time=25/dim, trace.mat=FALSE</code>
isres	nloptr	<code>maxeval=2e4, xtol_rel=1e-14, population=20*dim, algorithm="NLOPT_GN_ISRES"</code>
nlminbOpt	MSCMT/stats	<code>nrandom=30</code>
optimOpt	MSCMT/stats	<code>nrandom=25</code>
PSopt	NMOF	<code>nG=100, nP=20*dim</code>
psoptim	pso	<code>maxit=700</code>
soma	soma	<code>nMigrations=100</code>

If `outer.opar` is a list of lists, its names must correspond to (a subset of) the outer optimizers chosen in `outer.optim`.

`std.v` A character scalar containing one of the function names "sum", "mean", "min", or "max" for the standardization of the predictor weights (weights are divided by `std.v(weights)` before reporting). Defaults to "sum", partial matching allowed.

`alpha` A numerical vector with weights for the dependent variables in an MSCMT optimization or NULL (default). If not NULL, the length of `alpha` must agree with the number of dependent variables, NULL is equivalent to weight 1 for all dependent variables.

`beta` Either NULL (default), a numerical vector, or a list. If `beta` is a numerical vector or a list, its length must agree with the number of dependent variables.

- If `beta` is a numerical vector, the *i*th dependent variable is discounted with discount factor `beta[i]` (the observations of the dependent variables must thus be in chronological order!).
- If `beta` is a list, the components of `beta` must be numerical vectors with lengths corresponding to the numbers of observations for the individual

dependent variables. These observations are then multiplied with the corresponding component of beta.

gamma	<p>Either NULL (default), a numerical vector, or a list. If gamma is a numerical vector or a list, its length must agree with the number of predictor variables.</p> <ul style="list-style-type: none"> • If gamma is a numerical vector, the output of <code>agg.fns[i]</code> applied to the <i>i</i>th predictor variable is discounted with discount factor <code>gamma[i]</code> (the output of <code>agg.fns[i]</code> must therefore be in chronological order!). • If gamma is a list, the components of gamma must be numerical vectors with lengths corresponding to the lengths of the output of <code>agg.fns</code> for the individual predictor variables. The output of <code>agg.fns</code> is then multiplied with the corresponding component of gamma.
return.ts	A logical scalar. If TRUE (default), most results are converted to time series.
single.v	A logical scalar. If FALSE (default), a selection of feasible (optimal!) predictor weight vectors is generated. If TRUE, the one optimal weight vector which has maximal order statistics is generated to facilitate cross validation studies.
verbose	A logical scalar. If TRUE (default), output is verbose.
debug	A logical scalar. If TRUE, output is very verbose. Defaults to FALSE.
seed	A numerical vector or NULL. If not NULL, the random number generator is initialized with the elements of <code>seed</code> via <code>set.seed(seed)</code> (see Random) before calling the optimizer, performing repeated optimizations (and staying with the best) if <code>seed</code> has length greater than 1. Defaults to NULL. If not NULL, the seeds <code>int.seed</code> (default: 53058) and <code>unif.seed</code> (default: 812821) for genoud are also initialized to the corresponding element of <code>seed</code> , but this can be overridden with the list elements <code>int.seed</code> and <code>unif.seed</code> of (the corresponding element of) <code>outer.opar</code> .
c1	NULL (default) or an object of class <code>cluster</code> obtained by makeCluster of package <code>parallel</code> . Repeated estimations (see <code>outer.optim</code> and <code>seed</code>) and placebo studies will make use of the cluster <code>c1</code> (if not NULL).
times.pred.training	A matrix with two rows (containing start times in the first and end times in the second row) and one column for each predictor variable, where the column names must exactly match the names of the corresponding predictor variables (or NULL by default). If not NULL, <code>times.pred.training</code> defines training periods for cross-validation applications. For the format of the start and end times, see the documentation of parameter <code>times.pred</code> .
times.dep.validation	A matrix with two rows (containing start times in the first and end times in the second row) and one column for each dependent variable, where the column names must exactly match the names of the corresponding dependent variables (or NULL by default). If not NULL, <code>times.dep.validation</code> defines validation period(s) for cross-validation applications. For the format of the start and end times, see the documentation of parameter <code>times.dep</code> .
v.special	integer vector containing indices of important predictors with special treatment (see below). Defaults to the empty set.
cv.alpha	numeric scalar containing the minimal proportion (of the maximal feasible weight) for the weights of the predictors selected by <code>v.special</code> . Defaults to 0.

`spec.search.treated`

A logical scalar. If TRUE, a specification search (for the optimal set of included predictors) is done for the treated unit. Defaults to FALSE.

`spec.search.placebos`

A logical scalar. If TRUE, a specification search (for the optimal set of included predictors) is done for the control unit. Defaults to FALSE.

Details

`mscmt` combines, if necessary, the preparation of the raw data (which is expected to be in "list" format, possibly after conversion from a `data.frame` with function `listFromLong`) and the call to the appropriate MSCMT optimization procedures (depending on the input parameters). For details on the input parameters `alpha`, `beta`, and `gamma`, see [1]. For details on cross-validation, see [2].

Value

An object of class "mscmt", which is essentially a list containing the results of the estimation and, if applicable, the placebo study. The most important list elements are

- the weight vector `w` for the control units,
- a matrix `v` with weight vectors for the predictors in its columns,
- scalars `loss.v` and `rmspe` with the dependent loss and its square root,
- a vector `loss.w` with the predictor losses corresponding to the various weight vectors in the columns of `v`,
- a matrix `predictor.table` containing aggregated statistics of predictor values (similar to list element `tab.pred` of function `synth.tab` of package 'Synth'),
- a list of multivariate time series combined containing, for each dependent and predictor variable, a multivariate time series with elements `treated` for the actual values of the treated unit, `synth` for the synthesized values, and `gaps` for the differences.

Placebo studies produce a list containing individual results for each unit (as treated unit), starting with the original treated unit, as well as a list element named `placebo` with aggregated results for each dependent and predictor variable.

If `times.pred.training` and `times.dep.validation` are not NULL, a cross-validation is done and a list of elements `cv` with the results of the cross-validation period and `main` with the results of the main period is returned.

References

- [1] Becker M, Klößner S (2018). "Fast and Reliable Computation of Generalized Synthetic Controls." *Econometrics and Statistics*, **5**, 1–19. <https://doi.org/10.1016/j.ecosta.2017.08.002>.
- [2] Becker M, Klößner S, Pfeifer G (2018). "Cross-Validating Synthetic Controls." *Economics Bulletin*, **38**, 603-609. Working Paper, <http://www.accessecon.com/Pubs/EB/2018/Volume38/EB-18-V38-I1-P58.pdf>.

Examples

```
## Not run:
## for examples, see the package vignettes:
browseVignettes(package="MSCMT")

## End(Not run)
```

plot.mscmt

Plotting Results of MSCMT

Description

plot.mscmt plots results of mscmt.

Usage

```
## S3 method for class 'mscmt'
plot(
  x,
  what,
  type = c("gaps", "comparison", "placebo.gaps", "placebo.data"),
  treatment.time,
  zero.line = TRUE,
  ylab,
  xlab = "Date",
  main,
  sub,
  col,
  lty,
  lwd,
  legend = TRUE,
  bw = FALSE,
  ...
)
```

Arguments

- | | |
|------|---|
| x | An object of class "mscmt", usually obtained as the result of a call to function mscmt . |
| what | A character scalar. Name of the variable to be plotted. If missing, the (first) dependent variable will be used. |
| type | A character scalar denoting the type of the plot containing either "gaps", "comparison", "placebo.gaps", or "placebo.data". Partial matching allowed, defaults to "placebo.gaps", if results of a placebo study are present, and to "gaps", else. |

<code>treatment.time</code>	An optional numerical scalar. If not missing, a vertical dotted line at the given point in time is included in the plot. <code>treatment.time</code> is measured in years, but may as well be a decimal number to reflect treatment times different from January 1st.
<code>zero.line</code>	A logical scalar. If TRUE (default), a horizontal dotted line (at zero level) is plotted for "gaps" and "placebo" plots.
<code>ylab</code>	Optional label for the y-axis, automatically generated if missing.
<code>xlab</code>	Optional label for the x-axis, defaults to "Date".
<code>main</code>	Optional main title for the plot, automatically generated if missing.
<code>sub</code>	Optional subtitle for the plot. If missing, the subtitle is generated automatically for "comparison" and "gaps" plots.
<code>col</code>	Optional character vector with length corresponding to the number of units. Contains the colours for the different units, automatically generated if missing.
<code>lty</code>	Optional numerical vector with length corresponding to the number of units. Contains the line types for the different units, automatically generated if missing.
<code>lwd</code>	Optional numerical vector with length corresponding to the number of units. Contains the line widths for the different units, automatically generated if missing.
<code>legend</code>	A logical scalar. If TRUE (default), a legend is included in the plot.
<code>bw</code>	A logical scalar. If FALSE (default), the automatically generated colours and line types are optimized for a colour plot, if TRUE, the automatic colours and line types are set for a black and white plot.
<code>...</code>	Further optional parameters for the underlying <code>plot</code> function.

Details

A unified basic plot function for gaps plots, comparison of treated and synthetic values, as well as plots for placebo studies. Consider using `ggplot.mscmt` instead, which is the preferred plot method and has more functionality than `plot.mscmt`.

Value

Nothing useful (function is called for its side effects).

ppratio

Post-pre-(r)mspe-ratios for placebo studies

Description

`ppratio` calculates post-to-pre-(r)mspe-ratios for placebo studies.

Usage

```
ppratio(
  x,
  what,
  range.pre,
  range.post,
  type = c("rmspe", "mspe"),
  return.all = FALSE
)
```

Arguments

x	An object of class "mscmt", usually obtained as the result of a call to function mscmt .
what	A character vector. Name of the variable to be considered. If missing, the (first) dependent variable will be used.
range.pre	A vector of length 2 defining the range of the pre-treatment period with start and end time given as <ul style="list-style-type: none"> • annual dates, if the format of start/end time is "dddd", e.g. "2016", • quarterly dates, if the format of start/end time is "ddddQd", e.g. "2016Q1", • monthly dates, if the format of start/end time is "dddd?dd" with "?" different from "W" (see below), e.g. "2016/03" or "2016-10", • weekly dates, if the format of start/end time is "ddddWdd", e.g. "2016W23", • daily dates, if the format of start/end time is "dddd-dd-dd", e.g. "2016-08-18", corresponding to the format of the respective column of the times.dep argument of mscmt . If missing, the corresponding column of times.dep will be used.
range.post	A vector of length 2 defining the range of the post-treatment period with start and end time given as <ul style="list-style-type: none"> • annual dates, if the format of start/end time is "dddd", e.g. "2016", • quarterly dates, if the format of start/end time is "ddddQd", e.g. "2016Q1", • monthly dates, if the format of start/end time is "dddd?dd" with "?" different from "W" (see below), e.g. "2016/03" or "2016-10", • weekly dates, if the format of start/end time is "ddddWdd", e.g. "2016W23", • daily dates, if the format of start/end time is "dddd-dd-dd", e.g. "2016-08-18", corresponding to the format of the respective column of the times.dep argument of mscmt . Will be guessed if missing.
type	A character string. Either rmspe (default) or mspe. Selects whether root mean squared errors or mean squared errors are calculated.
return.all	A logical scalar. If FALSE (default), only the (named) vector of post-pre-(r)mspe-ratios is returned, if TRUE, a three-column matrix with pre- and post-treatment (r)mspe's as well as the post-pre-ratios will be returned.

Details

ppratio calculates post-to-pre-(r)mspe-ratios for placebo studies based on Synthetic Control Methods.

Value

If return.all is FALSE, a (named) vector of post-pre-(r)mspe-ratios. If return.all is TRUE, a matrix with three columns containing the pre-treatment (r)mspe, the post-treatment (r)mspe, and the post-pre-ratio.

print.mscmt

Printing Results of MSCMT

Description

print.mscmt prints results of mscmt.

Usage

```
## S3 method for class 'mscmt'
print(x, ...)
```

Arguments

x	An object of class "mscmt", usually obtained as the result of a call to function mscmt .
...	Further arguments to be passed to or from other methods. They are ignored in this function.

Details

A human-readable summary of mscmt's results.

Value

Nothing useful (function is called for its side effects).

pvalue *P-values for placebo studies*

Description

pvalue calculates p-values for placebo studies.

Usage

```
pvalue(
  x,
  what,
  range.pre,
  range.post,
  alternative = c("two.sided", "less", "greater"),
  exclude.ratio = Inf,
  ratio.type = c("rmspe", "mspe")
)
```

Arguments

- | | |
|------------|--|
| x | An object of class "mscmt", usually obtained as the result of a call to function mscmt . |
| what | A character vector. Name of the variable to be considered. If missing, the (first) dependent variable will be used. |
| range.pre | A vector of length 2 defining the range of the pre-treatment period with start and end time given as <ul style="list-style-type: none"> • annual dates, if the format of start/end time is "dddd", e.g. "2016", • quarterly dates, if the format of start/end time is "ddddQd", e.g. "2016Q1", • monthly dates, if the format of start/end time is "dddd?dd" with "?" different from "W" (see below), e.g. "2016/03" or "2016-10", • weekly dates, if the format of start/end time is "ddddWdd", e.g. "2016W23", • daily dates, if the format of start/end time is "dddd-dd-dd", e.g. "2016-08-18", corresponding to the format of the respective column of the times.dep argument of mscmt . If missing, the corresponding column of times.dep will be used. |
| range.post | A vector of length 2 defining the range of the post-treatment period with start and end time given as <ul style="list-style-type: none"> • annual dates, if the format of start/end time is "dddd", e.g. "2016", • quarterly dates, if the format of start/end time is "ddddQd", e.g. "2016Q1", • monthly dates, if the format of start/end time is "dddd?dd" with "?" different from "W" (see below), e.g. "2016/03" or "2016-10", • weekly dates, if the format of start/end time is "ddddWdd", e.g. "2016W23", |

- daily dates, if the format of start/end time is "dddd-dd-dd", e.g. "2016-08-18",
corresponding to the format of the respective column of the `times.dep` argument of `mscmt`. Will be guessed if missing.
- `alternative` A character string giving the alternative of the test. Either "two.sided" (default), "less", or "greater".
- `exclude.ratio` A numerical scalar (default: Inf). Control units with a pre-treatment-(r)mspe of more than `exclude.ratio` times the pre-treatment-(r)mspe of the treated unit are excluded from the calculations of the p-value.
- `ratio.type` A character string. Either `rmspe` (default) or `mspe`. Selects whether root mean squared errors or mean squared errors are calculated.

Details

`pvalue` calculates p-values for placebo studies based on Synthetic Control Methods.

Value

A time series containing the p-values for the post-treatment periods.

Examples

```
## Not run:  
## for an example, see the main package vignette:  
vignette("WorkingWithMSCMT",package="MSCMT")  
  
## End(Not run)
```

Index

`as.Date`, [7](#)

`compare`, [2](#)

`data.frame`, [10](#), [13](#), [17](#)

`Date`, [5](#), [6](#)

`did`, [3](#)

`genoud`, [16](#)

`ggplot`, [4](#), [8](#)

`ggplot.mscmt`, [2](#), [4](#), [8](#), [19](#)

`improveSynth`, [8](#)

`ipop`, [14](#)

`listFromLong`, [9](#), [13](#), [17](#)

`makeCluster`, [16](#)

`MSCMT`, [11](#)

`mscmt`, [2–5](#), [8](#), [12](#), [18](#), [20–23](#)

`MSCMT-package (MSCMT)`, [11](#)

`plot`, [19](#)

`plot.mscmt`, [8](#), [18](#), [19](#)

`ppratio`, [19](#)

`print.mscmt`, [2](#), [21](#)

`pvalue`, [22](#)

`Random`, [16](#)

`strptime`, [6](#)