

# Package ‘musica’

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**Type** Package

**Title** Multiscale Climate Model Assessment

**Version** 0.1.3

**Description** Provides functions allowing for (1) easy aggregation of multivariate time series into custom time scales, (2) comparison of statistical summaries between different data sets at multiple time scales (e.g. observed and bias-corrected data), (3) comparison of relations between variables and/or different data sets at multiple time scales (e.g. correlation of precipitation and temperature in control and scenario simulation) and (4) transformation of time series at custom time scales.

**License** GPL-2

**LazyData** TRUE

**Depends** R (>= 2.15.1), data.table

**Imports** magrittr, qmap, lubridate

**RoxygenNote** 5.0.1

**Suggests** knitr, rmarkdown, ggplot2

**VignetteBuilder** knitr

**NeedsCompilation** yes

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musica-package	<i>An R package for multiscale climate model assessment</i>
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## Description

Contains functions for flexible assessment of climate model bias and changes at multiple time scales. See documentation for [decomp](#), [compare](#) and [vcompare](#). In addition, musica provides functions for multiscale transformations of time series (see [msTrans\\_abs](#) and [msTrans\\_dif](#))

## Package options

Following option(s) are available:

**additive\_variables** At several places the package compares values. The character vector `additive_values` specifies for which variables difference should be used for comparison instead of ratio. Defaults to `additive_values = "TAS"`. See [options](#) for setting or examining options.

## Author(s)

Martin Hanel <hanel@fzp.czu.cz>

## References

Hanel, M., Kozin, R. (2016) Bias correction for hydrological modelling, submitted.

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basin_PT	<i>Basin average observed and simulated daily precipitation and temperature</i>
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## Description

A list of three `data.tables` with observed (`obs_ctrl`) and RCM simulated data for the control (`sim_ctrl`) and scenario (`sim_scen`) periods for Oslava basin (down to Cucice) in the Czech Republic. The basin average precipitation and temperature were obtained from gridded observations and RCM simulation (EUR-11\_CNRM-CERFACS-CNRM-CM5\_rcp45\_r1i1p1\_CLMcom-CCLM4-8-17 simulation conducted within the CORDEX project).

**Usage**

```
basin_PT
```

**Format**

List of 3 data.tables:

**obs\_ctrl** observed data for the basin for a period 1981-01-01 – 2005-21-31

**sim\_ctrl** simulated data for the basin for a period 1981-01-01 – 2005-21-31

**sim\_scen** simulated data for the basin for a period 2070-01-01 – 2099-21-31

Each data.table contains 3 variables:

**DTM** date

**PR** precipitation, mm

**TAS** temperature, degrees C

---

codes

*Conversion between period specification and codes*

---

**Description**

Conversion between period specification and codes

**Usage**

```
period2code(periods)
```

```
code2period(code)
```

**Arguments**

periods            period specification

code                period code

**Details**

Periods are specified using keywords "day", "month", "year" preceded by an integer and a space and optionally followed by "s" (the specification is further passed to `cut.Date`, see [cut.Date](#) for details). To fit in figures and for simplicity, periods can be also specified by codes, i.e. by D, M, Y (for "day", "month" and "year", respectively) and followed by integer specifying the number of intervals. The functions `period2code` and `code2period` provide conversion between the two alternatives.

**Examples**

```
period2code(c('1 day', '23 days', '3 month', '2 years'))
```

```
code2period(c('D1', 'D23', 'M3', 'Y2'))
```

---

 compare

*Compare decomposed variables*


---

### Description

The function evaluates distance between statistical characteristics of specified data sets. Distance is measured as difference for variables included in `getOption('additive_variables')`, i.e. temperature (TAS) by default, and as a ratio for other variables.

### Usage

```
compare(x, compare_to, fun = mean, wet_int_only = TRUE, wet_int_thr = 0.1,
        exclude_below = 0.9)
```

### Arguments

<code>x</code>	List of decomposed variables to be compared
<code>compare_to</code>	Decomposed variable used as a reference
<code>fun</code>	Function used for comparison
<code>wet_int_only</code>	(logical) Should only the wet intervals be considered?
<code>wet_int_thr</code>	Numeric value specifying the minimum depth to be considered wet
<code>exclude_below</code>	Some of the intervals might not be of required length, e.g. D10 interval may have less than 10 days available. The <code>exclude_below</code> argument controls the minimum fraction of the interval that has to be available in order to be considered in the summary statistics.

### Value

data.table summarizing the differences with columns:

**variable** factor indicating the variable

**period** specification of the averaging length with 'D' - day(s), 'M' - month(s), 'Y' - year(s) and 'G1' - the overall mean

**TS** averaging length in hours

**sub\_period** indication of the aggregating scale specified by `agg_by` argument

**comp** factor indicating the data sets from `x` with labels given by `names(x)`

**DIF** distance between data sets from `x` and `compare_to`. Distance is measured as difference for variables included in `getOption('additive_variables')`, i.e. temperature (TAS) by default, and as a ratio for other variables, see [dif](#)

**Examples**

```

library(ggplot2)
data(basin_PT)
## Not run:
dobs = decomp(basin_PT[['obs_ctrl']])
dctrl = decomp(basin_PT[['sim_ctrl']])
dscen = decomp(basin_PT[['sim_scen']])
d = compare(x = list(CTRL = dctrl, SCEN = dscen), compare_to = dobs, fun = max)
ggplot(d) +
  geom_line(aes(x = TS, y = DIF, col = factor(sub_period))) +
  facet_grid(variable ~ comp, scale = 'free') +
  scale_x_log10()

## End(Not run)

```

decomp

*Decomposition of time-series***Description**

Calculate series of averages over the periods specified in the period argument into the input data.table.

**Usage**

```
decomp(x, period = c("Y1", "M6", "M3", "M1", "D15", "D1"), agg_by = quarter,
       full_return = FALSE, remove_incomplete = TRUE)
```

**Arguments**

x	data.table with columns DTM (date), variable and value. Any number of variables are in principle allowed.
period	The periods over which the averages will be calculated, see Details
agg_by	Function for specification of the period (season, month) to be additionally included in output, see Details
full_return	(logical) Should the average be repeated for each scale along with original time series? Default is FALSE (e.g. for M1 only monthly and not daily time series is returned)
remove_incomplete	Should the incomplete years be removed from results? Default is TRUE

**Details**

The original time series in daily time step is decomposed into series of averages over periods specified in periods argument using letter codes 'D' - day(s), 'M' - month(s), 'Y' - year(s) followed by number corresponding to number of periods and 'G1' the overall mean. The periods must be given

in order from longest to shortest, the overall mean is always included (and needs not to be specified in period). Shorter periods are always identified within the closest longer periods, i.e. each shorter period is included in exactly one longer period. As a result, the averages may be calculated over shorter periods than specified. This is due to varying length of "month" and "year" periods. The actual length used for averaging is included in the output. To make further assessment of the decomposed objects easier, indicator of period within the year (e.g. quarter or month) as specified by `agg_by` argument is included in the output.

### Value

data.table with variables:

**variable** factor indicating the variable

**DTM** date

**period** specification of the averaging length with 'D' - day(s), 'M' - month(s), 'Y' - year(s) and 'G1' - the overall mean

**value** value of the variable for given averaging length

**sub\_period** indication of the aggregating scale specified by `agg_by` argument

**period\_pos** average date of the interval

**N** real length of the vectors used for calculating averages

**TS** averaging length in hours

### Examples

```
data(basin_PT)
str(basin_PT)
basin_PT[['obs_ctrl']]
dobs = decomp(basin_PT[['obs_ctrl']], period = c('1 year', '1 month', '1 day'))
```

---

difs

*Functions for evaluating distance between variables*

---

### Description

Functions for evaluating distance between variables

### Usage

```
dif(x, y, var)
```

```
rev_dif(x, y, var)
```

```
rev_difv(x, var)
```

**Arguments**

x, y	variables to be compared
var	variable code

**Value**

Difference or ratio of x and y (for dif) and sum or product (for rev\_dif and rev\_difv). Distance is measured as difference for variables included in `getOption('additive_variables')`, i.e. temperature (TAS) by default, and as a ratio for other variables.

While `rev_dif` returns `sum(x, y)` or `prod(x, y)`, `rev_difv` takes single vector x and returns `sum(x)` or `prod(x)`.

Used mainly in other functions of the package.

**Examples**

```
getOption('additive_variables')

# calculate distance of 2 vectors
dif(c(10, 20, 30), c(11, 18, 3), 'TAS')
dif(c(10, 20, 30), c(11, 18, 3), 'PR')

# inverse for 2 vectors
rev_dif(c(10, 20, 30), c(11, 18, 3), 'TAS')

# inverse for 1 vector
rev_difv(c(10, 1.1, .9), 'TAS')
```

---

m2s

*Indication of a season*


---

**Description**

Indication of a season

**Usage**

```
month2sea(dtm, year_starts = months(0))

sscale2sea(sub_scale, year_starts = months(0))
```

**Arguments**

dtm	a Date object
year_starts	Month object indicating the start of the year
sub_scale	integer indicating the season

**Value**

3 letter code (as DJF, JJA etc.) specifying the season

**Examples**

```
month2sea(as.Date('2000-01-01') + months(1:10) )
```

```
sscale2sea(c(1, 1, 2, 2, 2, 3, 3), year_starts = months(-1))
```

---

msTrans\_abs

*Multiscale quantile mapping bias correction*


---

**Description**

Applies standard quantile mapping at custom time scales.

**Usage**

```
msTrans_abs(dta, agg_by = month, wet_int_thr = 0.1, maxiter = 10,
            tol = 1e-04, qstep = 0.001, period = c("G1", "Y1", "M3", "M1", "D1"))
```

**Arguments**

dta	List with components FROM (simulated data for the control period), TO (observed data) and NEWDATA (data to be corrected). Each component is a data.table with columns DTM (date) and the climate variables (typically PR - precipitation and TAS - temperature)
agg_by	Function for specification of the period (season, month) to be additionally included in output, see Details
wet_int_thr	Numeric value specifying the minimum depth to be considered wet
maxiter	Maximum number of iterations, see Details
tol	Stopping criterion of the iteration cycle, see Details
qstep	A numeric value between 0 and 1. The quantile mapping is fitted only for the quantiles defined by <code>quantile(0,1,probs=seq(0,1,by=qstep)</code> . Passed to <code>doQmapQUANT</code> .
period	Specification of the aggregation lengths the correction is applied at with 'D' - day(s), 'M' - month(s), 'Y' - year(s) and 'G1' - the overall mean

**Details**

The procedure utilizes standard quantile mapping from the `qmap`-package, but at multiple time scales. Since correction at particular temporal scale influences values at other aggregations, the procedure is applied iteratively until the maximum number of iterations (`maxiter`) is reached or the difference between successive iteration step is smaller than `tol`. Differences between corrected and uncorrected variable at longer time scales are used to modify daily values after each iteration step (see e.g. Mehrorta and Sharma, 2016; Pegram et al. 2009). To make further assessment of the decomposed objects easier, indicator of period within the year (e.g. quarter or month) as specified by `agg_by` argument is included in the output.



**Value**

data.table with corrected data

**References**

Hanel, M., Kozin, R., 2016. Bias and projected changes in climate model simulations at multiple time scales: consequences for hydrological impact assessment. Environmental Modelling and Software, submitted.

Mehrotra, R., Sharma, A., 2016. A multivariate quantile-matching bias correction approach with auto-and cross-dependence across multiple time scales: Implications for downscaling. Journal of Climate 29, 3519-3539.

Pegram, G.G., et al., 2009. A nested multisite daily rainfall stochastic generation model. Journal of Hydrology 371, 142-153.

**Examples**

```
data("basin_PT")
scen = basin_PT$sim_scen
ctrl = basin_PT$sim_ctrl
obs = basin_PT$obs_ctrl
dta = list(TO = obs, FROM = ctrl, NEWDATA = scen)
## Not run:
msTrans_abs(dta, maxiter = 10, period = 'D1')

## End(Not run)
```

---

msTrans\_dif

*Multiscale delta method*


---

**Description**

Transforms observed data such that the changes in summary statistics of variables at custom time scales are similar to those obtained from climate model simulation. Number of functions can be used to summarize the variables.

**Usage**

```
msTrans_dif(dta, model = "const", model_par = list(NULL), agg_by = month,
  wet_int_thr = 0.1, maxiter = 10, tol = 1e-04, period = c("G1", "Y1",
  "M1", "D1"), qstep = 0.001)
```

**Arguments**

dta List with components FROM (simulated data for the control period), TO (simulated data for the scenario period) and NEWDATA (observed data to be transformed). Each component is a data.table with columns DTM (date) and the climate variables (typically PR - precipitation and TAS - temperature)

model	One of loess, const, identity, lm, smooth, runmed, smooth.spline. The model is used to provide statistical summary of the empirical cumulative distribution function.
model_par	optional parameters of the model
agg_by	Function for specification of the period (season, month) to be additionally included in output, see Details
wet_int_thr	Numeric value specifying the minimum depth to be considered wet
maxiter	Maximum number of iterations, see Details
tol	Stopping criterion of the iteration cycle, see Details
period	Specification of the aggregation lengths the correction is applied at with 'D' - day(s), 'M' - month(s), 'Y' - year(s) and 'G1' - the overall mean
qstep	A numeric value between 0 and 1. The ecdf is calculated only for the quantiles defined by quantile(0, 1, probs = seq(0, 1, by = qstep).

### Value

transformed data.table

### References

Hanel, M., Kozin, R., 2016. Bias and projected changes in climate model simulations at multiple time scales: consequences for hydrological impact assessment. Environmental Modelling and Software, submitted.

### Examples

```
data("basin_PT")
scen = basin_PT$sim_scen
ctrl = basin_PT$sim_ctrl
obs = basin_PT$obs_ctrl
dta = list(TO = scen, FROM = ctrl, NEWDATA = obs)
## Not run:
msTrans_dif(dta, maxiter = 10, period = 'D1')

## End(Not run)
```

---

prob

*Evaluation of empirical cumulative distribution function*

---

### Description

Evaluation of empirical cumulative distribution function

### Usage

prob(x)

**Arguments**

x                    vector of values

**Value**

value of the empirical distribution function evaluated at x

**Examples**

```
prob(rnorm(10))
```

---

Q

*Convenience function for calculation of quantiles*

---

**Description**

The typical use is in [compare](#) to avoid anonymous functions in specification of its fun argument.

**Usage**

```
Q(p, ...)
```

**Arguments**

p                    Specification of the quantile  
...                  other arguments passed to [quantile](#)

**Value**

function calculating the p-th quantile

**Examples**

```
q90 = Q(.9)  
class(q90)  
q90(rnorm(10))
```

---

tscale	<i>Convert averaging length code to hours</i>
--------	---

---

**Description**

Period durations are calculated by the [lubridate](#) package.

**Usage**

```
tscale(x, nyears = 30)
```

**Arguments**

x	Vector of the averaging period codes
nyears	Overall number of years - used for conversion of the overall mean

**Value**

numerical vector of durations in hours

**Examples**

```
tscale('M1')
tscale('G1', nyears = 25)
```

---

vcompare	<i>Assess the relations between two decomposed variables</i>
----------	--

---

**Description**

Assess the relations between two decomposed variables

**Usage**

```
vcompare(x, fun = cor, wet_int_only = TRUE, wet_int_thr = 0.1,
         exclude_below = 0.9)
```

**Arguments**

x	List of decomposed objects
fun	Function to summarize dependence (like cor, cov)
wet_int_only	(logical) Should only the wet intervals be considered?
wet_int_thr	Numeric value specifying the minimum depth to be consider wet
exclude_below	Some of the intervals might not be of required length, e.g. D10 interval may have less than 10 days available. The exclude_below argument controls the minimum fraction of the interval that has to be available in order to be considered in the summary statistics.

## Details

vcompare compares the relation between all pairs of variables included in `x`, typically precipitation and temperature, but other variables may be included also (e.g. runoff).

## Value

data.table summarizing the relation with columns:

**variable** factor indicating the variable

**period** specification of the averaging length with 'D' - day(s), 'M' - month(s), 'Y' - year(s) and 'G1' - the overall mean

**TS** averaging length in hours

**sub\_period** indication of the aggregating scale specified by `agg_by` argument

**comp** factor indicating the data sets from `x` with labels given by `names(x)`

**DIF** distance between data sets from `x` and `compare_to`. Distance is measured as difference for variables included in `getOption('additive_variables')`, i.e. temperature (TAS) by default, and as a ratio for other variables, see [dif](#)

## Examples

```
library(ggplot2)
data(basin_PT)
## Not run:
dobs = decomp(basin_PT[['obs_ctrl']])
dctrl = decomp(basin_PT[['sim_ctrl']])
d = vcompare(x = list(OBS = dobs, CTRL = dctrl), fun = cov)
ggplot(d[period!='G1']) +
  geom_line(aes(x = TS, y = value, col = factor(sub_period))) +
  facet_grid(VARS~ID) +
  scale_x_log10()

## End(Not run)
```

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