# Package 'pastclim'

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```
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Maintainer Andrea Manica <am315@cam.ac.uk>
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     in Leonardi et al. (2023) <doi:10.1111/ecog.06481>.
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# **Description**

Spatio-temporal series of monthly temperature and precipitation and 17 derived bioclimatic variables covering the last 5 Ma (Pliocene–Pleistocene), at intervals of 1,000 years, and a spatial resolution of 1 arc-degrees (see Barreto et al., 2023 for details).

#### **Details**

PALEO-PGEM-Series is downscaled to  $1 \times 1$  arc-degrees spatial resolution from the outputs of the PALEO-PGEM emulator (Holden et al., 2019), which emulates reasonable and extensively validated global estimates of monthly temperature and precipitation for the Plio-Pleistocene every 1 kyr at a spatial resolution of ~5 × 5 arc-degrees (Holden et al., 2016, 2019).

PALEO-PGEM-Series includes the mean and the standard deviation (i.e., standard error) of the emulated climate over 10 stochastic GCM emulations to accommodate aspects of model uncertainty. This allows users to estimate the robustness of their results in the face of the stochastic aspects of the emulations. For more details, see Section 2.4 in Barreto et al. (2023).

Note that this is a very large dataset, with 5001 time slices. It takes approximately 1 minute to set up each variable when creating a region\_slice or region\_series. However, once the object has been created, other operations tend to be much faster (especially if you subset the dataset to a small number of time steps of interest).

If you use this dataset, make sure to cite the original publications:

Barreto, E., Holden, P. B., Edwards, N. R., & Rangel, T. F. (2023). PALEO-PGEM-Series: A spatial time series of the global climate over the last 5 million years (Plio-Pleistocene). Global Ecology and Biogeography, 32, 1034-1045, doi:10.1111/geb.13683

Holden, P. B., Edwards, N. R., Rangel, T. F., Pereira, E. B., Tran, G. T., and Wilkinson, R. D. (2019): PALEO-PGEM v1.0: a statistical emulator of Pliocene–Pleistocene climate, Geosci. Model Dev., 12, 5137–5155, doi:10.5194/gmd1251372019.

Beyer2020 Documentat	ion for the Beyer2020 dataset
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# Description

This dataset covers the last 120k years, at intervals of 1/2 k years, and a resolution of 0.5 degrees in latitude and longitude.

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#### **Details**

If you use this dataset, make sure to cite the original publication:

Beyer, R.M., Krapp, M. & Manica, A. High-resolution terrestrial climate, bioclimate and vegetation for the last 120,000 years. Sci Data 7, 236 (2020). doi:10.1038/s4159702005521

The version included in pastclim has the ice sheets masked, as well as internal seas (Black and Caspian Sea) removed. The latter are based on:

```
https://www.marineregions.org/gazetteer.php?p=details&id=4278
https://www.marineregions.org/gazetteer.php?p=details&id=4282
```

As there is no reconstruction of their depth through time, modern outlines were used for all time steps.

Also, for bio15, the coefficient of variation was computed after adding one to monthly estimates, and it was multiplied by 100 following https://pubs.usgs.gov/ds/691/ds691.pdf

Changelog

v1.1.0 Added monthly variables. Files can be downloaded from: https://zenodo.org/deposit/7062281

v1.0.0 Remove ice sheets and internal seas, and use correct formula for bio15. Files can be downloaded from: doi:10.6084/m9.figshare.19723405.v1

bioclim\_vars

Compute bioclimatic variables

# Description

Function to compute "bioclimatic" variables from monthly average temperature and precipitation data. For modern data, this variables are generally computed using min and maximum temperature, but for many palaeoclimatic reconstructions only average temperature is available. Most variables, with the exception of BIO02 and BIO03, can be rephrased meaningfully in terms of mean temperature. This function is a modified version of predicts::bcvars.

# Usage

```
bioclim_vars(prec, tavg, ...)
## S4 method for signature 'numeric, numeric'
bioclim_vars(prec, tavg)
## S4 method for signature 'SpatRaster, SpatRaster'
bioclim_vars(prec, tavg, filename = "", ...)
## S4 method for signature 'SpatRasterDataset, SpatRasterDataset'
bioclim_vars(prec, tavg, filename = "", ...)
## S4 method for signature 'matrix, matrix'
bioclim_vars(prec, tavg)
```

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### **Arguments**

prec monthly precipitation

tavg monthly average temperatures

additional variables for specific methods filename where the raster can be stored.

#### **Details**

The variables are:

• BIO01 = Annual Mean Temperature

• BIO04 = Temperature Seasonality (standard deviation x 100)

• BIO05 = Max Temperature of Warmest Month

• BIO06 = Min Temperature of Coldest Month

• BIO07 = Temperature Annual Range (P5-P6)

• BIO08 = Mean Temperature of Wettest Quarter

• BIO09 = Mean Temperature of Driest Quarter

• BIO10 = Mean Temperature of Warmest Quarter

• BIO11 = Mean Temperature of Coldest Quarter

• BIO12 = Annual Precipitation

• BIO13 = Precipitation of Wettest Month

• BIO14 = Precipitation of Driest Month

• BIO15 = Precipitation Seasonality (Coefficient of Variation)

• BIO16 = Precipitation of Wettest Quarter

• BIO17 = Precipitation of Driest Quarter

• BIO18 = Precipitation of Warmest Quarter

• BIO19 = Precipitation of Coldest Quarter

These summary Bioclimatic variables are after:

Nix, 1986. A biogeographic analysis of Australian elapid snakes. In: R. Longmore (ed.). Atlas of elapid snakes of Australia. Australian Flora and Fauna Series 7. Australian Government Publishing Service, Canberra.

and expanded following the ANUCLIM manual

#### Value

the bioclim variables

climate\_for\_locations

clean\_data\_path

Clean the data path

# **Description**

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This function deletes old reconstructions that have been superseded in the data\_path. It assumes that the only files in data\_path are part of pastclim (i.e. there are no custom datasets stored in that directory).

# Usage

```
clean_data_path(ask = TRUE)
```

#### **Arguments**

ask

boolean on whether the user should be asked before deleting

### Value

TRUE if files are deleted successfully

climate\_for\_locations Extract local climate for one or more locations for a given time slice.

# Description

```
Deprecated version of location_slice()
Deprecated version of location_slice()
```

### Usage

```
climate_for_locations(...)
climate_for_locations(...)
```

# **Arguments**

```
... arguments to be passed to location_slice()
```

#### Value

- a data.frame with the climatic variables of interest
- a data.frame with the climatic variables of interest

climate\_for\_time\_slice 7

```
climate_for_time_slice
```

Extract a climate slice for a region

# Description

Deprecated version of region\_slice()]

#### **Usage**

```
climate_for_time_slice(...)
```

# **Arguments**

... arguments to be passed to region\_slice()

### Value

a SpatRaster terra::SpatRaster object, with each variable as a layer.

# **Description**

Extract the climatic information from a region series and organise them as a data frame.

### Usage

```
df_from_region_series(x, xy = TRUE)
```

# Arguments

```
x climate time series generated with region_series()
```

a boolean whether x and y coordinates should be added to the dataframe (default to TRUE)

# Details

To extract a data frame from a region slice, see df\_from\_region\_slice().

### Value

a data.frame where each cell each raster layer (i.e. timestep) is a row, and the available variables are columns.

8 distance\_from\_sea

### **Description**

Extract the climatic information from a region slice and organise it as a data frame. This is just a wrapper around terra::as.data.frame().

# Usage

```
df_from_region_slice(x, xy = TRUE)
```

### **Arguments**

x climate time slice (i.e. a terra::SpatRaster) generated with region\_slice()
xy a boolean whether x and y coordinates should be added to the dataframe (default to TRUE)

### **Details**

To extract a data frame from a region series, see df\_from\_region\_series().

# Value

a data.frame where each cell the raster is a row, and the available variables are columns.

# Description

Get the land mask for a dataset at a given time point, and compute distance from the sea for each land pixel.

### Usage

```
distance_from_sea(time_bp = NULL, time_ce = NULL, dataset)
```

# Arguments

time_bp	time slice in years before present (negative)
time_ce	time slice in years CE. Only one of time_bp or time_ce should be used.
dataset	string defining the dataset to use (a list of possible values can be obtained with list available datasets()). This function will not work on custom datasets.

download\_dataset 9

### Value

a terra::SpatRaster of distances from the coastline in km

download_dataset	Download palaeoclimate reconstructions.	

# Description

This function downloads palaeoclimate reconstructions. Files will be stored in the data path of pastclim, which can be inspected with get\_data\_path() and changed with set\_data\_path()

# Usage

```
download_dataset(dataset, bio_variables = NULL, annual = TRUE, monthly = FALSE)
```

# **Arguments**

dataset	string defining	dataset to be	downloaded (	a list of	possible values	can be ob-

tained with list\_available\_datasets()). This function will not work on

custom datasets.

bio\_variables one or more variable names to be downloaded. If left to NULL, all variables

available for this dataset will be downloaded (the parameters annual and monthly,

see below, define which types)

annual boolean to download annual variables
monthly boolean to download monthly variables

# Value

TRUE if the dataset(s) was downloaded correctly.

Example Documentation for the Example dataset
---

# **Description**

This dataset is a subset of Beyer2020, used for the vignette of pastclim. Do not use this dataset for any real work, as it might not reflect the most up-to-date version of Beyer2020.

10 get\_biome\_classes

```
get_available_datasets
```

Get the available datasets.

# **Description**

List the datasets available in pastclim, which can be passed to functions in pastclim as values for the parameter dataset. Most functions can also be used on custom datasets by setting dataset="custom"

# Usage

```
get_available_datasets()
```

# **Details**

This function provides a user-friendly list, summarising the many datasets available from World-Clim. A comprehensive list of all available datasets can be obtained with list\_available\_datasets.

#### Value

a character vector of the available datasets

get\_biome\_classes

Get the biome classes for a dataset.

### **Description**

Get a full list of biomes and how their id as coded in the biome variable for a given dataset.

# Usage

```
get_biome_classes(dataset)
```

# Arguments

dataset

string defining dataset to be downloaded (a list of possible values can be obtained with list\_available\_datasets()). This function will not work on custom datasets.

### Value

a data.frame with columns id and category.

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get\_data\_path

Get the data path where climate reconstructions are stored

# **Description**

This function returns the path where climate reconstructions are stored.

# Usage

```
get_data_path(silent = FALSE)
```

# **Arguments**

silent

boolean on whether a message is returned when data\_path is not set (i.e. equal to NULL)

#### **Details**

The path is stored in an option for pastclim named data\_path. If a configuration file was saved when using  $set_data_path()$ , the path is retrieved from a file named "pastclim\_data.txt", which is found in the directory returned by tools::R\_user\_dir("pastclim", "config") (i.e. the default configuration directory for the package as set in R >= 4.0).

### Value

the data path

```
get_downloaded_datasets
```

Get the variables downloaded for each dataset.

# **Description**

List the downloaded variable for each dataset.

### Usage

```
get_downloaded_datasets(data_path = NULL)
```

### **Arguments**

data\_path

leave it to NULL to use the default data\_path

#### Value

a list of variable names per dataset.

12 get\_ice\_mask

get\_file\_for\_dataset Get the file details for a variable and dataset.

# Description

Internal getter function

# Usage

```
get_file_for_dataset(variable, dataset)
```

# Arguments

variable one or more variable names to be downloaded

dataset string defining dataset to be downloaded (a list of possible values can be ob-

tained with list\_available\_datasets()). This function will not work on

custom datasets.

### Value

the filename for that variable and dataset

get\_ice\_mask Get the ice mask for a dataset.

#### **Description**

Get the ice mask for a dataset, either for the whole series or for specific time points.

#### Usage

```
get_ice_mask(time_bp = NULL, dataset)
```

### **Arguments**

time\_bp time slices in years before present (negative values represent time before present,

positive values time in the future). This parameter can be a vector of times (the slices need to exist in the dataset), a list with a min and max element setting the range of values, or left to NULL to retrieve all time steps. To check which slices

are available, you can use get\_time\_bp\_steps().

dataset string defining dataset to be downloaded (a list of possible values can be ob-

tained with list\_available\_datasets()). This function will not work on

custom datasets.

### Value

a binary terra::SpatRaster with the ice mask as 1s

get\_land\_mask 13

get_land_mask	Get the land mask for a dataset.

# Description

Get the land mask for a dataset, either for the whole series or for specific time points.

# Usage

```
get_land_mask(time_bp = NULL, time_ce = NULL, dataset)
```

# Arguments

time_bp	time slices in years before present (negative values represent time before present, positive values time in the future). This parameter can be a vector of times (the slices need to exist in the dataset), a list with a min and max element setting the range of values, or left to NULL to retrieve all time steps. To check which slices are available, you can use get_time_bp_steps().
time_ce	time in years CE as an alternative to time_bp.Only one of time_bp or time_ce should be used. For available time slices in years CE, use get_time_ce_steps().
dataset	string defining dataset to be downloaded (a list of possible values can be obtained with list_available_datasets()). This function will not work on custom datasets.

# Value

```
a binary terra::SpatRaster with the land mask as 1s
```

```
get_mis_time_steps Get time steps for a given MIS
```

# Description

Get the time steps available in a given dataset for a MIS.

# Usage

```
get_mis_time_steps(mis, dataset, path_to_nc = NULL)
```

# Arguments

mis	string giving the mis; it must use the same spelling as used in mis_boundaries
dataset	string defining dataset to be downloaded (a list of possible values can be ob-
	tained with list_available_datasets()). If set to "custom", then a single no
	file is used from "path_to_nc"
path_to_nc	the path to the custom nc file containing the palaeoclimate reconstructions. All the variables of interest need to be included in this file.

14 get\_varname

### Value

a vector of time steps

get\_time\_bp\_steps

Get time steps for a given dataset

# **Description**

Get the time steps (in time\_bp or time\_ce) available in a given dataset.

### Usage

```
get_time_bp_steps(dataset, path_to_nc = NULL)
get_time_ce_steps(dataset, path_to_nc = NULL)
get_time_steps(dataset, path_to_nc = NULL)
```

# **Arguments**

dataset string defining dataset to be downloaded (a list of possible values can be ob-

tained with list\_available\_datasets()). If set to "custom", then a single nc

file is used from "path\_to\_nc"

path\_to\_nc the path to the custom nc file containing the palaeoclimate reconstructions. All

the variables of interest need to be included in this file.

### Value

a vector of time steps (in time\_bp, or time\_ce)

get\_varname

Get a the varname for this variable

# Description

Internal function to get the varname for this variable

### Usage

```
get_varname(variable, dataset)
```

# Arguments

variable string defining the variable name

dataset string defining dataset to be downloaded

get\_vars\_for\_dataset 15

# Value

the name of the variable

```
get_vars_for_dataset Get a list of variables for a given dataset.
```

# Description

This function lists the variables available for a given dataset. Note that the spelling and use of capitals in names might differ from the original publications, as pastclim harmonises the names of variables across different reconstructions.

# Usage

```
get_vars_for_dataset(
  dataset,
  path_to_nc = NULL,
  details = FALSE,
  annual = TRUE,
  monthly = FALSE
)
```

# **Arguments**

dataset	string defining dataset to be downloaded (a list of possible values can be obtained with list_available_datasets()).
path_to_nc	the path to the custom nc file containing the palaeoclimate reconstructions. If a custom nc file is given, 'details', 'annual' and 'monthly' are ignored
details	boolean determining whether the output should include information including long names of variables and their units.
annual	boolean to show annual variables
monthly	boolean to show monthly variables

### Value

a vector of variable names

is\_region\_series

HYDE\_3.3\_baseline

Documentation for HYDE 3.3 dataset

### **Description**

This database presents an update and expansion of the History Database of the Global Environment (HYDE, v 3.3) and replaces former HYDE 3.2 version from 2017. HYDE is and internally consistent combination of updated historical population estimates and land use. Categories include cropland, with a new distinction into irrigated and rain fed crops (other than rice) and irrigated and rain fed rice. Also grazing lands are provided, divided into more intensively used pasture, converted rangeland and non-converted natural (less intensively used) rangeland. Population is represented by maps of total, urban, rural population and population density as well as built-up area.

### **Details**

The period covered is 10 000 BCE to 2023 CE. Spatial resolution is 5 arc minutes (approx. 85 km2 at the equator). The full HYDE 3.3 release contains: a Baseline estimate scenario, a Lower estimate scenario and an Upper estimate scenario. Currently only the baseline scenario is available in pastclim

If you use this dataset, make sure to cite the original publication for the HYDE 3.2 (there is no current publication for 3.3):

Klein Goldewijk, K., Beusen, A., Doelman, J., and Stehfest, E.: Anthropogenic land-use estimates for the Holocene; HYDE 3.2, Earth Syst. Sci. Data, 9, 927-953, 2017. doi:10.5194/essd912017

is\_region\_series

Check the object is a valid region series

### Description

A region series is a terra::SpatRasterDataset for which each sub-dataset is a variable, and all variables have the same number of time steps.

# Usage

```
is_region_series(x, strict = FALSE)
```

### **Arguments**

x a terra::SpatRasterDataset representing a time series of regional reconstructions obtained from region\_series().

strict a boolean defining whether to preform a thorough test (see description above for details).

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#### **Details**

The standard test only checks that all sub-datasets (each of which is a terra::SpatRaster) have the same number of layers. The more thorough test (obtained with *strict=TRUE*) actually checks that all variables have the same identical time steps by comparing the result of terra::time() applied to each variable.

#### Value

TRUE if the object is a region series

Krapp2021

Documentation for the Krapp2021 dataset

### **Description**

This dataset covers the last 800k years, at intervals of 1k years, and a resolution of 0.5 degrees in latitude and longitude.

#### **Details**

The units of several variables have been changed to match what is used in WorldClim.

If you use this dataset, make sure to cite the original publication:

Krapp, M., Beyer, R.M., Edmundson, S.L. et al. A statistics-based reconstruction of high-resolution global terrestrial climate for the last 800,000 years. Sci Data 8, 228 (2021). doi:10.1038/s41597-021010093

The version included in pastclim has the ice sheets masked.

Note that, for bio15, we use the corrected version, which follows https://pubs.usgs.gov/ds/691/ds691.pdf

### Changelog

v1.4.0 Change units to match WorldClim. Fix variable duplication found on earlier versions of the dataset. https://zenodo.org/records/8415273

v1.1.0 Added monthly variables. Files can be downloaded from: https://zenodo.org/record/7065055

v1.0.0 Remove ice sheets and use correct formula for bio15. Files can be downloaded from: doi:10.6084/m9.figshare.19733680.v1

18 location\_series

```
list_available_datasets
```

List all the available datasets.

### **Description**

List the datasets available in pastclim. The list is comprehensive, and includes all combinations of models and future scenarios for WorldClim. For a more user-friendly list, use get\_available\_datasets(). Most functions can also be used on custom datasets by setting dataset="custom"

# Usage

```
list_available_datasets()
```

#### Value

a character vector of the available datasets

location\_series

Extract a time series of bioclimatic variables for one or more locations.

# Description

This function extract a time series of local climate for a set of locations. Note that this function does not apply any interpolation (as opposed to location\_slice()). If you have a coastal location that just falls into the water for the reconstructions, you will have to amend the coordinates to put it more firmly on land.

# Usage

```
location_series(
    x,
    time_bp = NULL,
    time_ce = NULL,
    coords = NULL,
    bio_variables,
    dataset,
    path_to_nc = NULL,
    nn_interpol = FALSE,
    buffer = FALSE,
    directions = 8
)
```

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#### **Arguments**

x a data frame with columns of x and y coordinates (and an optional name column), or a vector of cell numbers. See coords for standard coordinate names,

or how to use custom ones.

time\_bp time slices in years before present (negative values represent time before present,

positive values time in the future). This parameter can be a vector of times (the slices need to exist in the dataset), a list with a min and max element setting the range of values, or left to NULL to retrieve all time steps. To check which slices

are available, you can use get\_time\_bp\_steps().

time\_ce time slice in years CE (see time\_bp for options). For available time slices in

years CE, use get\_time\_ce\_steps(). Only one of time\_bp or time\_ce should

be used.

coords a vector of length two giving the names of the "x" and "y" coordinates, as found

in data. If left to NULL, the function will try to guess the columns based on standard names c("x", "y"), c("X", "Y"), c("longitude", "latitude"), or

c("lon", "lat")

bio\_variables vector of names of variables to be extracted.

dataset string defining the dataset to use. If set to "custom", then a single nc file is used

from "path to nc"

path\_to\_nc the path to the custom nc file containing the palaeoclimate reconstructions. All

the variables of interest need to be included in this file.

nn\_interpol boolean determining whether nearest neighbour interpolation is used to estimate

climate for cells that lack such information (i.e. they are under water or ice). By default, interpolation is only performed from the first ring of nearest neighbours; if climate is not available, NA will be returned for that location. The number of neighbours can be changed with the argument directions. nn\_interpol

defaults to FALSE (this is DIFFERENT from location\_slice().

buffer boolean determining whether the variable will be returned as the mean of a

buffer around the focal cell. If set to TRUE, it overrides nn\_interpol (which provides the same estimates as buffer but only for locations that are in cells with an NA). The buffer size is determined by the argument directions. buffer

defaults to FALSE.

directions character or matrix to indicate the directions in which cells are considered con-

nected when using nn\_interpol or buffer. The following character values are allowed: "rook" or "4" for the horizontal and vertical neighbours; "bishop" to get the diagonal neighbours; "queen" or "8" to get the vertical, horizontal and diagonal neighbours; or "16" for knight and one-cell queen move neighbours. If directions is a matrix it should have odd dimensions and have logical (or 0, 1)

values.

#### Value

a data frame with the climatic variables of interest

20 location\_slice

location\_slice

Extract local climate for one or more locations for a given time slice.

# Description

This function extract local climate for a set of locations at the appropriate times (selecting the closest time slice available for the specific date associated with each location).

# Usage

```
location_slice(
    x,
    time_bp = NULL,
    time_ce = NULL,
    coords = NULL,
    bio_variables,
    dataset,
    path_to_nc = NULL,
    nn_interpol = TRUE,
    buffer = FALSE,
    directions = 8
)
```

# Arguments

x	a data.frame with columns x and y coordinates(see coords for standard coordinate names, or how to use custom ones), plus optional columns time_bp or time_ce (depending on the units used) and name. Alternatively, a vector of cell numbers.
time_bp	used if no time_bp column is present in x: the dates in years before present (negative values represent time before present, i.e. 1950, positive values time in the future) for each location.
time_ce	time in years CE as an alternative to ${\tt time\_bp.Only}$ one of ${\tt time\_bp}$ or ${\tt time\_ce}$ should be used.
coords	a vector of length two giving the names of the "x" and "y" coordinates, as found in data. If left to NULL, the function will try to guess the columns based on standard names $c("x", "y"), c("X", "Y"), c("longitude", "latitude"), or c("lon", "lat")$
bio_variables	vector of names of variables to be extracted.
dataset	string defining the dataset to use. If set to "custom", then a single nc file is used from "path_to_nc"
path_to_nc	the path to the custom nc file containing the palaeoclimate reconstructions. All the variables of interest need to be included in this file.

nn\_interpol

boolean determining whether nearest neighbour interpolation is used to estimate climate for cells that lack such information (i.e. they are under water or ice). By default, interpolation is only performed from the first ring of nearest neighbours; if climate is not available, NA will be returned for that location. The number of neighbours can be changed with the argument directions. nn\_interpol defaults to TRUE.

buffer

boolean determining whether the variable will be returned as the mean of a buffer around the focal cell. If set to TRUE, it overrides nn\_interpol (which provides the same estimates as buffer but only for locations that are in cells with an NA). The buffer size is determined by the argument directions. buffer defaults to FALSE.

directions

character or matrix to indicate the directions in which cells are considered connected when using nn\_interpol or buffer. The following character values are allowed: "rook" or "4" for the horizontal and vertical neighbours; "bishop" to get the diagonal neighbours; "queen" or "8" to get the vertical, horizontal and diagonal neighbours; or "16" for knight and one-cell queen move neighbours. If directions is a matrix it should have odd dimensions and have logical (or 0, 1) values.

#### Value

a data.frame with the climatic variables of interest.

```
location_slice_from_region_series
```

Extract local climate for one or more locations for a given time slice.

### Description

This function extract local climate for a set of locations at the appropriate times (selecting the closest time slice available for the specific date associated with each location).

# Usage

```
location_slice_from_region_series(
    x,
    time_bp = NULL,
    time_ce = NULL,
    coords = NULL,
    region_series,
    nn_interpol = TRUE,
    buffer = FALSE,
    directions = 8
)
```

22 mis\_boundaries

### **Arguments**

x a data.frame with columns x and y coordinates(see coords for standard coor-

dinate names, or how to use custom ones), plus optional columns time\_bp or time\_ce (depending on the units used) and name. Alternatively, a vector of cell

numbers.

time\_bp used if no time\_bp column is present in x: the dates in years before present

(negative values represent time before present, i.e. 1950, positive values time in

the future) for each location.

time\_ce time in years CE as an alternative to time\_bp. Only one of time\_bp or time\_ce

should be used.

coords a vector of length two giving the names of the "x" and "y" coordinates, as found

in data. If left to NULL, the function will try to guess the columns based on standard names c("x", "y"), c("X", "Y"), c("longitude", "latitude"), or

c("lon", "lat")

region\_series a SpatRasterDataset obtained with region\_series()

nn\_interpol boolean determining whether nearest neighbour interpolation is used to estimate

climate for cells that lack such information (i.e. they are under water or ice). By default, interpolation is only performed from the first ring of nearest neighbours; if climate is not available, NA will be returned for that location. The number of neighbours can be changed with the argument directions. nn\_interpol

defaults to TRUE.

buffer boolean determining whether the variable will be returned as the mean of a

buffer around the focal cell. If set to TRUE, it overrides nn\_interpol (which provides the same estimates as buffer but only for locations that are in cells with an NA). The buffer size is determined by the argument directions. buffer

defaults to FALSE.

directions character or matrix to indicate the directions in which cells are considered con-

nected when using nn\_interpol or buffer. The following character values are allowed: "rook" or "4" for the horizontal and vertical neighbours; "bishop" to get the diagonal neighbours; "queen" or "8" to get the vertical, horizontal and diagonal neighbours; or "16" for knight and one-cell queen move neighbours. If directions is a matrix it should have odd dimensions and have logical (or 0, 1)

values.

#### Value

a data.frame with the climatic variables of interest.

mis\_boundaries

Time boundaries of marine isotope stages (MIS).

### **Description**

A dataset containing the beginning and end of MIS.

pastclim 23

### Usage

mis\_boundaries

#### **Format**

A data frame with 24 rows and 2 variables:

mis the stage, a stringstart the start of a given MIS, in kyaend the start of a given MIS, in kya

pastclim

pastclim

### **Description**

This R library is designed to provide an easy way to extract and manipulate palaeoclimate reconstructions for ecological and anthropological analyses.

#### **Details**

The functionalities of pastclim are described in Leonardi et al. (2023) doi:10.1111/ecog.06481. Please cite it if you use pastclim in your research.

On its dedicated website, you can find Articles giving you a step-by-step overview of the package, and a cheatsheet. There is also a version of the site updated for the dev version (on the top left, the version number is in red, and will be in the format x.x.x.9xxx, indicating it is a development version).

pastclim currently includes data from Beyer et al 2020, a reconstruction of climate based on the HadCM3 model for the last 120k years, and Krapp et al 2021, which covers the last 800k years. The reconstructions are bias-corrected and downscaled to 0.5 degree. More details on these datasets can be found here. There are also instructions on how to build and use custom datasets.

region\_extent

Region extents.

# **Description**

A list of extents for major regions.

# Usage

region\_extent

### **Format**

A list of vectors giving the extents.

24 region\_outline\_union

region\_outline

Region outlines.

# Description

An sf::sf object containing outlines for major regions. Outlines that span the antimeridian have been split into multiple polygons.

# Usage

```
region_outline
```

# **Format**

```
sf::sf of outlines.
```

name names of regions

region\_outline\_union Region outlines unioned.

# Description

An sf::sf object containing outlines for major regions. Each outline is represented as a single polygon. If you want multiple polygons, use region\_outline.

# Usage

```
region_outline_union
```

### **Format**

```
sf::sf of outlines.
```

name names of regions

region\_series 25

region\_series

Extract a time series of climate variables for a region

# Description

This function extracts a time series of one or more climate variables for a given dataset covering a region (or the whole world). The function returns a terra::SpatRasterDataset object, with each variable as a sub-dataset.

# Usage

```
region_series(
   time_bp = NULL,
   time_ce = NULL,
   bio_variables,
   dataset,
   path_to_nc = NULL,
   ext = NULL,
   crop = NULL
)
```

# Arguments

time_bp	time slices in years before present (negative values represent time before present, positive values time in the future). This parameter can be a vector of times (the slices need to exist in the dataset), a list with a min and max element setting the range of values, or left to NULL to retrieve all time steps. To check which slices are available, you can use get_time_bp_steps().
time_ce	time slices in years CE (see time_bp for options). For available time slices in years CE, use get_time_ce_steps(). Only one of time_bp or time_ce should be used.
bio_variables	vector of names of variables to be extracted
dataset	string defining the dataset to use. If set to "custom", then a single nc file is used from "path_to_nc"
path_to_nc	the path to the custom nc file containing the palaeoclimate reconstructions. All the variables of interest need to be included in this file.
ext	an extent, coded as numeric vector (length=4; order= xmin, xmax, ymin, ymax) or a terra::SpatExtent object. If NULL, the full extent of the reconstruction is given.
crop	a polygon used to crop the reconstructions (e.g. the outline of a continental mass). A sf::sfg or a terra::SpatVector object is used to define the polygon.

### Value

a terra::SpatRasterDataset object, with each variable as a sub-dataset.

26 region\_slice

regi	nΩ	SI	1	CE

Extract a climate slice for a region

# Description

This function extracts a slice of one or more climate variables for a given dataset covering a region (or the whole world). The function returns a SpatRaster terra::SpatRaster object, with each variable as a layer.

# Usage

```
region_slice(
  time_bp = NULL,
  time_ce = NULL,
  bio_variables,
  dataset,
  path_to_nc = NULL,
  ext = NULL,
  crop = NULL
```

# Arguments

time_bp	the time slice in years before present (negative values represent time before present, positive values time in the future). The slice needs to exist in the dataset. To check which slices are available, you can use get_time_bp_steps().
time_ce	time slice in years CE. For available time slices in years CE, use <pre>get_time_ce_steps()</pre> . Only one of time_bp or time_ce should be used.
bio_variables	vector of names of variables to be extracted
dataset	string defining the dataset to use. If set to "custom", then a single nc file is used from "path_to_nc"
path_to_nc	the path to the custom nc file containing the palaeoclimate reconstructions. All the variables of interest need to be included in this file.
ext	an extent, coded as numeric vector (length=4; order= xmin, xmax, ymin, ymax) or a terra::SpatExtent object. If NULL, the full extent of the reconstruction is given.
crop	a polygon used to crop the reconstructions (e.g. the outline of a continental mass). A sf::sfg or a terra::SpatVector object is used to define the polygon.

# Value

a SpatRaster terra::SpatRaster object, with each variable as a layer.

sample\_region\_series 27

sample\_region\_series Sample points from a region time series

# Description

This function samples points from a region time series. Sampling can either be performed for the same locations at all time steps (if only one value is given for size), or for different locations for each time step (if size is a vector of length equal to the number of time steps). To sample the same number of points, but different locations, for each time step, provide a vector repeating the same value for each time step.

# Usage

```
sample_region_series(x, size, method = "random", replace = FALSE, na.rm = TRUE)
```

# **Arguments**

Х	a terra::SpatRasterDataset returned by region_series()
size	number of points sampled. A single value is used to sample the same locations across all time steps, a vector of values to sample different locations at each time step.
method	one of the sampling methods from ${\tt terra::spatSample()}.$ It defaults to "random"
replace	boolean determining whether we sample with replacement
na.rm	boolean determining whether NAs are removed

### **Details**

This function wraps terra::spatSample() to appropriate sample the terra::SpatRasters in the terra::SpatRasterDataset returned by region\_series().

### Value

a data.frame with the sampled cells and their respective values for the climate variables.

```
sample_region_slice Sample points from a region time slice
```

# Description

This function samples points from a region time slice (i.e. a time point).

### Usage

```
sample_region_slice(x, size, method = "random", replace = FALSE, na.rm = TRUE)
```

28 set\_data\_path

# **Arguments**

X	a terra::SpatRaster returned by region_slice()
size	number of points sampled.
method	one of the sampling methods from $terra::spatSample()$ . It defaults to "random"
replace	boolean determining whether we sample with replacement
na.rm	boolean determining whether NAs are removed

#### **Details**

This function wraps terra::spatSample() to appropriate sample the terra::SpatRaster returned by region\_slice(). You can also use terra::spatSample() directly on a slice (which is a standard terra::SpatRaster).

#### Value

a data.frame with the sampled cells and their respective values for the climate variables.

# Description

This function sets the path where climate reconstructions will be stored. This information is stored in a file names "pastclim\_data.txt", which is found in the directory returned by tools:: $R_user_dir("pastclim", "config")$  (i.e. the default configuration directory for the package as set in R >= 4.0).

# Usage

```
set_data_path(
  path_to_nc = NULL,
  ask = TRUE,
  write_config = TRUE,
  copy_example = TRUE,
  on_CRAN = FALSE
)
```

### **Arguments**

path_to_nc	the path to the file that contains the downloaded reconstructions. If left unset, the default location returned by tools:: $R_user_dir("pastclim","data")$ will be used
ask	boolean on whether the user should be asked to confirm their choices
write_config	boolean on whether the path should be saved in a config file
copy_example	boolean on whether the example dataset should be saved in the data_path
on_CRAN	boolean; users should NOT need this parameters. It is used to set up a data path in the temporary directory for examples and tests to run on CRAN.

slice\_region\_series 29

### Value

TRUE if the path was set correctly

### **Description**

This function extracts a time slice from time series of one or more climate variables for a given dataset covering a region (or the whole world).

# Usage

```
slice_region_series(x, time_bp = NULL, time_ce = NULL)
```

### **Arguments**

x climate time series generated with region\_series()

time\_bp time slice in years before present (i.e. 1950, negative integers for values in the

past). The slices need to exist in the dataset. To check which slices are available,

you can use  $time_bp(x)$ .

time\_ce time slice in years CE. Only one of time\_bp or time\_ce should be used.

### Value

a SpatRaster of the relevant slice.

### **Description**

This functions extracts and sets time in years BP (i.e. from 1950) for a terra::SpatRaster or a terra::SpatRasterDataset. In a terra::SpatRaster object, time is stored with unit "years", which are years from 0AD. This means that, when a summary of the terra::SpatRaster is inspected, the times will appear as time\_bp+1950. The same applies when the function terra::time() is used instead of time\_bp().

### Usage

```
time_bp(x)

## S4 method for signature 'SpatRaster'
time_bp(x)

## S4 method for signature 'SpatRasterDataset'
time_bp(x)

time_bp(x) <- value

## S4 replacement method for signature 'SpatRaster'
time_bp(x) <- value

## S4 replacement method for signature 'SpatRaster'
time_bp(x) <- value</pre>
```

### **Arguments**

```
x a terra::SpatRaster
value a numeric vector of times in years BP
```

#### Value

a date in years BP (where negative numbers indicate a date in the past)

```
time_series_for_locations
```

Extract a time series of bioclimatic variables for one or more locations.

# Description

Deprecated version of location\_series()

### Usage

```
time_series_for_locations(...)
```

# Arguments

```
... arguments to be passed to location_series()
```

### Value

a data.frame with the climatic variables of interest

update\_dataset\_list 31

# Description

If a newer dataset list (which includes all the information about the files storing the data for past-clim), download it and start using it as 'dataset\_list\_included.csv' in tools::R\_user\_dir("pastclim", "config"). If the latter is present, the last column, named 'dataset\_list\_v', provides the version of this table, and the most advanced table is used.

# Usage

```
update_dataset_list(on_cran = FALSE)
```

# **Arguments**

on\_cran

boolean to make this function run on ci tests using tempdir

### Value

TRUE if the dataset was updated

validate\_nc

Validate an netcdf file for pastclim

# Description

This function validates a netcdf file as a potential dataset for pastclim. The key checks are: a) that the dimensions (longitude, latitude and time) have been set correctly. b) that all variables have the appropriate metadata (longname and units)

# Usage

```
validate_nc(path_to_nc)
```

### **Arguments**

path\_to\_nc

path to the nc file of interest

### Value

TRUE if the file is valid.

32 var\_labels

var\_labels

Generate pretty variable labels for plotting

# Description

Generate pretty labels (in the form of an expression) that can be used for plotting

# Usage

```
var_labels(x, dataset, with_units = TRUE, abbreviated = FALSE)
```

# **Arguments**

X	either a character vector with the names of the variables, or a terra::SpatRaster generated with [region_slice())] [region_slice())]: R:region_slice())
dataset	string defining dataset to be downloaded (a list of possible values can be obtained with list_available_datasets()). This function will not work on custom datasets.
with_units	boolean defining whether the label should include units
abbreviated	boolean defining whether the label should use abbreviations for the variable

### Value

a expression that can be used as a label in plots

### **Examples**

```
var_labels("bio01", dataset = "Example")

# set the data_path for this example to run on CRAN
# users don't need to run this line
set_data_path(on_CRAN = TRUE)

# for a SpatRaster
climate_20k <- region_slice(
   time_bp = -20000,
   bio_variables = c("bio01", "bio10", "bio12"),
   dataset = "Example"
)
terra::plot(climate_20k, main = var_labels(climate_20k, dataset = "Example"))
terra::plot(climate_20k, main = var_labels(climate_20k,
   dataset = "Example",
   abbreviated = TRUE
))</pre>
```

WorldClim\_2.1 33

WorldClim\_2.1

Documentation for the WorldClim datasets

#### **Description**

WorldClim version 2.1 is a database of high spatial resolution global weather and climate data, covering both the present and future projections. If you use this dataset, make sure to cite the original publication:

#### **Details**

Fick, S.E. and R.J. Hijmans, 2017. WorldClim 2: new 1km spatial resolution climate surfaces for global land areas. International Journal of Climatology 37 (12): 4302-4315. doi:10.1002/joc.5086

**Present-day reconstructions** are based on the mean for the period 1970-2000, and are available at multiple resolutions of 10 arc-minutes, 5 arc-minutes, 2.5 arc-minute and 0.5 arc-minutes. The resolution of interest can be obtained by changing the ending of the dataset name *WorldClim\_2.1\_RESm*, e.g. *WorldClim\_2.1\_10m* or *WorldClim\_2.1\_5m* (currently, only 10m and 5m are currently available in pastclim). In pastclim, the datasets are given a date of 1985 CE (the mid-point of the period of interest), corresponding to a time\_bp of 35. There are 19 "bioclimatic" variables, as well as monthly estimates for minimum, mean, and maximum temperature, and precipitation.

**Future projections** are based on the models in CMIP6, downscaled and de-biased using WorldClim 2.1 for the present as a baseline. Monthly values of minimum temperature, maximum temperature, and precipitation, as well as 19 bioclimatic variables were processed for 23 global climate models (GCMs), and for four Shared Socio-economic Pathways (SSPs): 126, 245, 370 and 585. Model and SSP can be chosen by changing the ending of the dataset name *WorldClim\_2.1\_GCM\_SSP\_RESm*.

Available values for GCM are: "ACCESS-CM2", "BCC-CSM2-MR", "CMCC-ESM2", "EC-Earth3-Veg", "FIO-ESM-2-0", "GFDL-ESM4", "GISS-E2-1-G", "HadGEM3-GC31-LL", "INM-CM5-0", "IPSL-CM6A-LR", "MIROC6", "MPI-ESM1-2-HR", "MRI-ESM2-0", and "UKESM1-0-LL". For SSP, use: "ssp126", "ssp245", "ssp370", and "ssp585". RES takes the same values as for present reconstructions (i.e. "10m", "5m", "2.5m", and "0.5m"). Example dataset names are *WorldClim\_2.1\_ACCESS-CM2\_ssp245\_10m* and *WorldClim\_2.1\_MRI-ESM2-0\_ssp370\_5m* 

The dataset are averages over 20 year periods (2021-2040, 2041-2060, 2061-2080, 2081-2100). In pastclim, the midpoints of the periods (2030, 2050, 2070, 2090) are used as the time stamps. All 4 periods are automatically downloaded for each combination of GCM model and SSP, and are selected as usual by defining the time in functions such as region\_slice().

ybp2date

Convert years BP from pastclim to lubridate date, or vice versa

#### **Description**

These functions convert between years BP as used by pastclim (negative numbers going into the past, positive into the future) and standard POSIXct date objects.

34 ybp2date

# Usage

```
ybp2date(x)
date2ybp(x)
```

# Arguments

Χ

a time in years BP using the pastclim convention of negative numbers indicating years into the past, or a POSIXct date object

# Value

```
a POSIXct date object, or a vector
```

# Examples

```
ybp2date(-10000)
ybp2date(0)
# back and forth
date2ybp(ybp2date(-10000))
```

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