Package 'sarp.snowprofile.alignment'

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Title Snow Profile Alignment, Aggregation, and Clustering

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Description Snow profiles describe the vertical (1D) stratigraphy of layered snow with different layer characteristics, such as grain type, hardness, deposition date, and many more. Hence, they represent a data format similar to multivariate time series containing categorical, ordinal, and numerical data types. Use this package to align snow profiles by matching their individual layers based on Dynamic Time Warping (DTW). The aligned profiles can then be assessed with an independent, global similarity measure that is geared towards avalanche hazard assessment. Finally, through exploiting data aggregation and clustering methods, the similarity measure provides the foundation for grouping and summarizing snow profiles according to similar hazard conditions. In particular, this package allows for averaging large numbers of snow profiles with DTW Barycenter Averaging and thereby facilitates the computation of individual layer distributions and summary statistics that are relevant for avalanche forecasting purposes. For more background information refer to Herla, Horton, Mair, and Haegeli (2021) <doi:10.5194/gmd-14-239-2021>, and Herla, Mair, and Haegeli (2022) <doi:10.5194/tc-16-3149-2022>.

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averageSP

Average a group of snow profiles

Description

The functions dbaSP and averageSP implement Dynamic Time Warping Barycenter Averaging of snow profiles. The convenient wrapper averageSP takes care of choosing several appropriate initial conditions and picking the optimal end result (by minimizing the mean squared error between the average profile and the profile set). To pay appropriate attention to (thin) weak layers, weak layers need to be labeled in the profiles. You can either do that manually before calling this routine to suit your personal needs, or you can provide specific properties (in classifyPWLs) so that weak layers be labeled according to these properties by sarp.snowprofile::labelPWL. For more details, refer to the reference paper.

Usage

```
averageSP(
  SPx,
  n = 5.
  sm = summary(SPx),
  progressbar = require("progress", quietly = TRUE, character.only = TRUE),
  progressbar_pretext = NULL,
  classifyPWLs = list(pwl_gtype = c("SH", "DH")),
  classifyCRs = list(pwl_gtype = c("MFcr", "IF", "IFsc", "IFrc")),
  proportionPWL = 0.5,
  breakAtSim = 0.9,
 breakAfter = 2,
  verbose = FALSE,
  tz = "auto",
)
dbaSP(
  SPx,
 Avg,
  sm = summary(SPx),
  resamplingRate = 0.5,
  proportionPWL = 0.3,
 maxiter = 10,
  breakAtSim = 0.99,
  breakAfter = 1,
  plotChanges = FALSE,
  verbose = TRUE,
  tz = "auto",
)
```

Arguments

SPx SPx a snowprofileSet object. Note that the profile layers need to contain a col-

umn called \$layer0fInterest which classifies weak layers. While averageSP will label weak layers automatically if not done by the user beforehand, dbaSP won't do that but fail instead!; consider thinking about how you want to label weak layers, see Description, classifyPWLs below, and the references. Also note, that if you wish to average the *rescaled* profile set, do so manually before

calling this function (see examples).

n the number of initial conditions that will be used to run dbaSP; see also choose-

ICavg.

sm a summary of SPx metadata

progressbar should a progressbar be displayed (the larger n, the more meaningful the pro-

gressbar)

progressbar_pretext

a character string to be prepended to the progressbar (mainly used by higher

level cluster function)

classifyPWLs an argument list for a function call to sarp.snowprofile::findPWL which returns

relevant PWLs for identifying initial conditions. **Importantly**, these arguments will also be used to label weak layers in the profiles, if these labels do not yet exist in the layers objects as column \$layerOfInterest. Check out the documentation of find DWL to familiaring yourself with your manifold entires.

mentation of findPWL to familiarize yourself with your manifold options!

classifyCRs an argument list for a function call to sarp.snowprofile::findPWL which returns

relevant crusts for identifying initial conditions.

proportionPWL decimal number that specifies the proportion required to average an ensemble

of grain types as weak layer type. A value of 0.3, for example, means that layers will get averaged to a PWL type if 30% of the layers are of PWL type. Meaningful range is between [0.1, 0.5]. Values larger than 0.5 get set to 0.5.

breakAtSim stop iterations when simSP between the last average profiles is beyond that

value. Can range between [0, 1]. Default values differ between dbaSP and

averageSP.

breakAfter integer specifying how many values of simSP need to be above breakAtSim to

stop iterating. Default values differ between dbaSP and averageSP.

verbose print similarities between old and new average in between iterations?

tz timezone of profiles; necessary for assigning the correct timezone to the average

profile's ddate/bdate. Either 'auto' or a timezone known to [as.POSIXct].

alignment configurations which are passed on to dbaSP and then further to dtwSP. Note, that you can't provide rescale2refHS, which is always set to

FALSE. If you wish to rescale the profiles, read the description of the SPx pa-

rameter and the examples.

Avg the initial average snow profile: either a snowprofile object or an index to an

initial average profile in SPx

resamplingRate Resampling rate for a regular depth grid among the profiles

maxiter maximum number of iterations

plotChanges specify whether and how you want to plot the dba process: either FALSE, 'TRUE=='iterations', or 'av-

erages+last''

Details

Technical note: Since the layer characteristics of the average profile represent the median characteristics of the individual profiles, it can happen that ddates of the averaged layers are not in a monotonical order. That is, of course unphysical, but we specifically decided not to override these values to highlight these slight inconsistencies to users, so that they can decide how to deal with them. As a consequence, the function sarp.snowprofile::deriveDatetag does not work for these average profiles with ddate inconsistencies, but throws an error. The suggested workaround for this issue is to apply that function to all individual profiles *before* computing the average profile. This ensures that bdates or datetags are also included in the average profile.

For developers: Including new variables into the averaging/dba routines can be done easily by following commit #9f9e6f9

Value

A list of class avgSP that contains the fields

- \$avg: the resulting average profile
- \$set: the corresponding resampled profiles of the group
- \$call: (only with averageSP) the function call
- \$prelabeledPWLs: (only with averageSP) boolean scalar whether PWLs (or any other layers of interest) were prelabeled before this routine (TRUE) or labeled by this routine with the defaults specified in classifyPWLs (FALSE)

The profile layers of the average profile refer to the median properties of the predominant layers. For example, if you labeled all SH/DH layers as your 'layersOfInterest', and you find a SH or DH layer in the average profile, then it means that the predominant grain type is SH/DH (i.e., more profiles than specified in proportionPWL have that layer) and layer properties like hardness, p_unstable, etc refer to the median properties of these SH/DH layers. If you find a RG layer in your average profile, it means that most profiles have that RG layer and the layer properties refer to the median properties of all these RG layers. There are two exceptions to this rule, one for height/depth, and one for layer properties with the ending _all, such as ppu_all:

- height and depth provide the vertical grid of the average profile, and for algorithmic reasons, this grid is not always equal to the actual median height or depth of the predominant layers. To account for that, two layer columns exist called medianPredominantHeight and medianPredominantDepth.
- Properties ending with _all: For example, while ppu refers to the proportion of profiles, whose *predominant* layers are unstable (i.e., p_unstable >= 0.77), ppu_all refers to the the proportion of profiles, whose layers are unstable while taking into account *all* individual layers matched to this average layer (i.e., despite grain type, etc).
- Other layer properties specific to the average profile: distribution ranges between [0, 1] and specifies the proportion of profiles that contain the predominant layer described in the other properties.

Functions

- averageSP: convenient wrapper function
- dbaSP: DTW barycenter averaging of snow profiles (low level worker function)

Author(s)

fherla

References

Herla, F., Haegeli, P., and Mair, P. (2022). A data exploration tool for averaging and accessing large data sets of snow stratigraphy profiles useful for avalanche forecasting, The Cryosphere, 16(8), 3149–3162, https://doi.org/10.5194/tc-16-3149-2022

See Also

averageSPalongSeason

```
## EXAMPLES OF averageSP
this_example_runs_about_10s <- TRUE
if (!this_example_runs_about_10s) { # exclude from cran checks
## compute the average profile of the demo object 'SPgroup'
## * by labeling SH/DH layers as weak layers,
## - choosing 3 initial conditions with an above average number of weak layers
## - in as many depth ranges as possible
\#\# * and neglecting crusts for initial conditions
 avgList \leftarrow averageSP(SPgroup, n = 3,
                       classifyPWLs = list(pwl_gtype = c("SH", "DH")),
                       classifyCRs = NULL)
 opar \leftarrow par(mfrow = c(1, 2))
 plot(avgList$avg, ymax = max(summary(avgList$set)$hs))
 plot(avgList$set, SortMethod = "unsorted", xticklabels = "originalIndices")
 par(opar)
## compute the average profile of the demo object 'SPgroup'
## * by labeling SH/DH/FC/FCxr layers with an RTA threshold of 0.65 as weak layers,
## * otherwise as above
 SPx <- computeRTA(SPgroup)</pre>
 avgList <- averageSP(SPx, n = 3,
                       classifyPWLs = list(pwl_gtype = c("SH", "DH", "FC", "FCxr"),
                                            threshold_RTA = 0.65),
                       classifyCRs = NULL)
 opar \leftarrow par(mfrow = c(1, 2))
 plot(avgList$avg, ymax = max(summary(avgList$set)$hs))
 plot(avgList$set, SortMethod = "unsorted", xticklabels = "originalIndices")
 par(opar)
## compute the average profile of the other demo object 'SPgroup2', which
## contains more stability indices, such as SK38 or p_unstable
```

averageSPalongSeason

```
## * by labeling SH/DH/FC/FCxr layers that either
     - have an SK38 below 0.95, *or*
    - have a p_unstable above 0.77
 SPx <- snowprofileSet(SPgroup2)</pre>
 avgList <- averageSP(SPx,</pre>
                        classifyPWLs = list(pwl_gtype = c("SH", "DH", "FC", "FCxr"),
                                             threshold_SK38 = 0.95, threshold_PU = 0.77))
 opar \leftarrow par(mfrow = c(1, 2))
 plot(avgList$avg, ymax = max(summary(avgList$set)$hs))
 plot(avgList$set, SortMethod = "unsorted", xticklabels = "originalIndices")
 par(opar)
}
## EXAMPLES OF dbaSP
## either rescale profiles beforehand...
if (FALSE) { # don't run in package check to save time
 SPx <- reScaleSampleSPx(SPgroup)$set</pre>
                                               # rescale profiles
 SPx <- snowprofileSet(lapply(SPx, labelPWL)) # label PWLs</pre>
 DBA <- dbaSP(SPx, 5, plotChanges = TRUE)</pre>
                                                  # average profiles
}
## or use unscaled snow heights:
if (FALSE) { # don't run in package check to save time
 SPx <- snowprofileSet(lapply(SPgroup, labelPWL)) # label PWLs</pre>
 DBA <- dbaSP(SPx, 5, plotChanges = TRUE)</pre>
                                                     # average profiles
}
```

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averageSPalongSeason Compute a seasonal timeseries of an average snowprofile

Description

This routine computes the seasonal timeseries of the average snow profile for a given region/set of profiles. The total snow height of the seasonal average profile closely follows the *median snow height* represented by the group of profiles each day. Also the new snow amounts represent the *median new snow amounts* within the group (i.e., PP and DF grains). The routine maintains temporal consistency by using the previous day average profile as initial condition to derive the next day's. This creates the need for re-scaling the layer thicknesses each day to account for snow settlement and melting. Two different re-scaling approaches have been implemented, which both aim to re-scale the old snow part of the column (i.e., the snow which was on the ground already at the previous day). See parameter description for more details. Also note, that the routine can be started at any day of the season by providing an average profile from the previous day. The routine modifies several parameters, which are passed on to dtwSP. These parameters differ from the defaults specified in dtwSP, which are held very generic, whereas the application in this function is much more

specific to certain requirements and algorithm behavior. For more details, refer to the reference paper.

Usage

```
averageSPalongSeason(
 SPx,
  sm = summary(SPx),
 AvgDayBefore = NULL,
 DateEnd = max(sm\$date),
  keep.profiles = TRUE,
 progressbar = require("progress", quietly = TRUE, character.only = TRUE),
  dailyRescaling = c("settleTopOldSnow", "settleEntireOldSnow")[1],
  proportionPWL = 0.3,
 breakAtSim = 0.9,
 breakAfter = 2,
  verbose = FALSE,
  resamplingRate = 0.5,
  top.down = FALSE,
  checkGlobalAlignment = FALSE,
  prefLayerWeights = NA,
 dims = c("gtype", "hardness", "ddate"),
 weights = c(0.375, 0.125, 0.5),
)
```

Arguments

SPx

a snowprofileSet that contains all profiles from the region to be averaged at all days of the season for which you want to compute the average profile. Identically to dbaSP, weak layers need to be labeled prior to this function call, see dbaSP and sarp.snowprofile::labelPWL. Note that only daily sampling is allowed at this point (i.e., one profile per grid point per day).

sm

a summary of SPx containing meta-data

AvgDayBefore

an average snowprofile from the previous day. This is only necessary if you want to resume the computation mid season.

DateEnd

an end date character string ("YYYY-MM-DD") if you only want to compute the timeseries up to a certain point in time. Defaults to the future-most date contained in the meta-data object sm.

keep.profiles

Do you want to keep the (resampled) individual snow profiles from SPx in your return object? **Note** that this must be TRUE if you plan to backtrackLayers to derive any kind of summary statistics for the averaged layers. See Notes below, and examples of how to conveniently backtrackLayers.

progressbar

display a progress bar during computation?

dailyRescaling choose between two settlement rescaling approaches. settleEntireOldSnow re-scales the entire old snow column so that the average snow height represents the median snow height from the profile set. settleTopOldSnow (the default) re-scales the upper part of the old snow column to achieve the same goal. While the former mostly leads to buried layers being settled to too deep snow depths, the default approach aims to leave those buried layers unchanged, which are located at depths that represent the median depths of their aligned layers.

proportionPWL decimal number that specifies the proportion required to average an ensemble

of grain types as weak layer type. A value of 0.3, for example, means that layers will get averaged to a PWL type if 30% of the layers are of PWL type. Meaningful range is between [0.1, 0.5]. Values larger than 0.5 get set to 0.5.

breakAtSim stop iterations when simSP between the last average profiles is beyond that

value. Can range between [0, 1]. Default values differ between dbaSP and

averageSP.

breakAfter integer specifying how many values of simSP need to be above breakAtSim to

stop iterating. Default values differ between dbaSP and averageSP.

verbose print similarities between old and new average in between iterations?

resamplingRate Resampling rate for a regular depth grid among the profiles

top.down a dtwSP parameter, which needs to be set to FALSE to ensure correct growing of

the snowpack during snowfall.

checkGlobalAlignment

a dtwSP parameter, which needs to be set to FALSE analogous to top. down

prefLayerWeights

a dtwSP parameter. Might be best to set this to NA, but can potentially be set to layerWeightingMat(FALSE) *in case of* averaging a very large geographic

region with temporal lags between weather events.

dims a dtwSP parameter, which is modified to include deposition date alignments per

default

weights a dtwSP parameter that sets the according weights to the dims specified above.

... any other parameters passed on to dbaSP and then dtwSP.

Details

Computing the seasonal average profile for an entire season and about 100 grid points (with a max of 150 cm snow depth) takes roughly 60 mins.

Value

A list of class avgSP_timeseries containing the fields \$avgs with a snowprofileSet of the average profiles at each day. If keep.profiles == TRUE a field \$sets with the according profiles informing the average profile at each day (which can be used to backtrackLayers to compute summary statistics of the averaged layers). And two fields \$call and \$meta. The latter contains several useful meta-information such as ...\$date, ...\$hs, ...\$hs_median, ...\$thicknessPPDF_median, or ...\$rmse, which gauges the representativity of the average profile (the closer to 0, the better; the closer to 1, the worse).

Note

- If you don't provide an AvgDayBefore, it will be computed with averageSP and *default* parameters (dots won't be passed to initializing the first average profile)!
- Even though backtrackLayers allows for backtracking layers based on height, it is not recommended to try and backtrack layers if keep.profiles = FALSE, since profiles that can't be aligned to the average profile (\$avgs[[i]]) are being discarded from the profile set at that day (\$sets[[i]]), which changes queryIDs in the backtrackingTable. Conclusion: If you want to backtrack layers from the seasonal average profile, you *must* keep.profiles = TRUE. See examples!

Author(s)

fherla

References

Herla, F., Haegeli, P., and Mair, P. (2022). A data exploration tool for averaging and accessing large data sets of snow stratigraphy profiles useful for avalanche forecasting, The Cryosphere, 16(8), 3149–3162, https://doi.org/10.5194/tc-16-3149-2022

See Also

```
dbaSP, averageSP, sarp.snowprofile::labelPWL
```

```
run_the_examples <- FALSE # exclude long-running examples</pre>
if (run_the_examples) {
## compute average timeseries for simplistic example data set 'SPspacetime'
## first: label weak layers (you can choose your own rules and thresholds!)
SPspacetime <- snowprofileSet(lapply(SPspacetime, function(sp) {</pre>
labelPWL(sp, pwl_gtype = c("SH", "DH", "FC", "FCxr"), threshold_RTA = 0.8)
})) # label weak layers in each profile of the profile set 'SPspacetime'
## second: average along several days
avgTS <- averageSPalongSeason(SPspacetime)</pre>
## explore resulting object
names(avgTS)
# timeseries figure
plot(avgTS$avgs, main = "average time series")
# add line representing median snow height
lines(avgTS$meta$date, avgTS$meta$hs_median)
# add line representing median new snow amounts
lines(avgTS$meta$date, avgTS$meta$hs - avgTS$meta$thicknessPPDF_median, lty = 'dashed')
# individual profile sets from one day
plot(avgTS$sets[[1]], SortMethod = "hs", main = "individual profiles from first day")
```

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backtrackLayers

Backtrack layers from average or summary profile

Description

An average profile as computed by dbaSP summarizes the prevalent layer properties of the entire profile set. To better understand the distribution of layer properties within the set, use this function to retrieve layers of interest from the individual profiles of the original profile set.

Usage

```
backtrackLayers(
  avgProfile,
  layer = NA,
  profileSet = NULL,
  layer_units = "row#",
  condition = NULL,
  computationByHeight = FALSE
)
```

Arguments

avgProfile	an average profile as per dbaSP
layer	the height or row number of the layer to retrieve the distribution for (given as height or row number of the average profile). If layer is NA, all layers from the avgProfile are considered.
profileSet	the profile set that is averaged by avgProfile. Optimally, it is the resampled profile set as returned by dbaSP or averageSP, see parameter computationByHeight if that resampled profile set is not available anymore.
layer_units	either "row#" or "cm"

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condition

a condition that subsets which layers are returned. E.g., only layers with a specific grain type, etc.. Note that the condition needs to be substituted in the function call, e.g. condition = substitute(gtype == "SH"). In most cases, it's best to subset the data.frame manually after this function has been called. A secret and dangerous trick is to use condition = substitute(gtype %in% return_conceptually_similar_gtypes(as.character(avgProfile\$layers\$gtype[lidx]))) to get the very same layers that have been used to compute the median layer properties which are included in the avgProfile\$layers.

computationByHeight

There are two ways of how to backtrack layers that were aligned to avgProfile\$layers. The first and safest approach is by index, which requires the resampled profileSet as returned by dbaSP or averageSP. The second approach is by layer height, which should yield the same results (beta phase: still bugs possible, check yourself!) and allows to backtrack the layers even if the resampled profileSet is not available anymore, but only the original unmodified set which was used to create the average profile.

Value

This function returns a list of data.frames with the backtracked layers. Each (named) list item corresponds to a specific layer height (cm).

Author(s)

fherla

Examples

See Vignette for examples.

chooseICavg

Get index of appropriate initial condition average profile

Description

To average a set of snow profiles, dbaSP requires a snow profile as initial condition (IC) to start the algorithm. To prevent persistent weak layers (PWLs) and crusts from being averaged-out during the call to dbaSP, it is advised to start the algorithm with a best-guess IC. This best guess IC contains a large number of PWLs and crusts to ensure that the most prevalent ones actually make their way into the final average profile. This function helps to choose meaningful IC profiles. See Details or (better) the source code for how this function picks the profiles.

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Usage

```
chooseICavg(
  set,
  n,
  classifyPWLs,
  classifyCRs,
  nPWL = round((2 * n/3) + 0.001),
  sm = summary(set)
)
```

Arguments

set	a snowprofileSet
n	number of profile indices to be picked (i.e., returned)
classifyPWLs	an argument list for a function call to sarp.snowprofile::findPWL which returns relevant PWLs for identifying initial conditions
classifyCRs	an argument list for a function call to sarp.snowprofile::findPWL which returns relevant CR(ust)s for identifying initial conditions
nPWL	number of profile indices to be picked from profiles that have many PWLs in many different vertical levels; an analogous nCR will be the difference n - nPWL.
sm	a (precomputed) summary of the set

Details

This function first computes how many PWLs and how many crusts are in the profiles that have a close to median total snow height HS. Each of these profile is then divided into several vertical levels (by numberOfPWLsPerVerticalLevel). nPWL and nCR profiles are then randomly picked from the profiles that have PWLs or CR in most vertical levels and additionally have a rather large number of PWLs/CR overall. The larger n, the more profiles with decreasing number of PWLs/CR in different levels are also returned. Note that this function is best applied to large profile sets to obtain semi-random results. For small sets, the indices returned can actually be deterministic since the pool of relevant profiles is too small.

Value

n number of indices that correspond to profiles in the set

Author(s)

fherla

See Also

sarp.snowprofile::findPWL, averageSP

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Examples

ddateDistance

Deposition Date Distance

Description

Calculate the distance (i.e. dissimilarity) between two deposition dates

Usage

```
ddateDistance(
  ddate1,
  ddate2,
  normalizeBy = 5,
  clipWindow = FALSE,
  na.dist = 0.5
)
```

Arguments

ddate1 1D array of POSIX dates

ddate2 same format and length as ddate1

normalizeBy Numeric scalar to be used for normalization, i.e. the number of days, that defines

the distance value of 1

clipWindow Should differences larger than 'normalizeBy' number of days be set to distance

'Infinity'? default FALSE.

na.dist replace NA values with that distance

Value

An array of length(ddate1) containing the distances according to the configurations.

Author(s)

fherla

densityDistance 15

Examples

densityDistance

Difference in layer density

Description

Calculate the difference (i.e. distance) in layer density

Usage

```
densityDistance(density1, density2, normalize = FALSE, absDist = TRUE)
```

Arguments

density1 numeric density values (1D array)
density2 numeric density values (1D array)

normalize Should result be normalized? boolean, default False.

absDist Interested in absolute distance? default True.

Value

numeric density distance

Author(s)

pbillecocq

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distanceSP

Wrapper for dtwSP and simSP

Description

Calculate the distance between two snowprofile objects by

Usage

```
distanceSP(query, ref, ...)
```

Arguments

query The query snowprofile object (will be warped onto ref)
ref The reference snowprofile object (will *not* be warped)
... passed on to dtwSP

Details

- 1. Matching their layers and aligning them (i.e., warp one profile onto the other one)
- 2. Assessing the similarity of the aligned profiles based on avalanche hazard relevant characteristics
- 3. Convert the similarity score into a distance value between [0, 1]

This procedure is useful for clustering and aggregating tasks, given a set of multiple profiles.

Author(s)

fherla

See Also

```
dtwSP, simSP, medoidSP
```

distMatSP

Calculate a multidimensional distance matrix between two profiles

Description

This routine calculates a distance matrix for two given profiles (query and ref). Analogously to other DTW routines, the query is arranged along the matrix rows, the ref along the columns. Every cell of the matrix represents the distance between the corresponding profile layers. The distance is calculated based on the specified layer properties (e.g., hardness, gtype, ddate). The routine calls subroutines to calculate the distance for each property and combines the normalized distances by weighted averaging.

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Usage

```
distMatSP(
  query,
  ref,
  dims = c("hardness", "gtype"),
  weights = c(0.2, 0.8),
  gtype_distMat = sim2dist(grainSimilarity_align(FALSE)),
  prefLayerWeights = layerWeightingMat(FALSE),
  ddateNorm = 5,
  windowFunction = warpWindowSP,
  top.down.mirroring = FALSE,
  warn.if.na.in.distance.calc = FALSE,
  ...
)
```

Arguments

query The query snowprofile object ref The ref snowprofile object

dims Character vector containing the layer properties to calculate the distance over.

Currently implemented are the properties hardness, gtype, ddate, density,

ogs.

weights Numeric vector of the same length as dims specifying the averaging weights to

each element of dims.

gtype_distMat A symmetric distance scoring matrix provided as data.frame that stores infor-

mation about the distances between the encountered grain types of the provided profiles. Default is the corresponding distance matrix of grainSimilarity_align,

cf. sim2dist.

prefLayerWeights

A matrix similar to gtype_distMat, but storing weights for preferential layer matching, e.g. defaults to layerWeightingMat; the higher the values for a given grain type pair, the more the algorithm will try to match those layers above others. To turn weighting scheme off, set profil averWeights = NA

others. To turn weighting scheme off, set prefLayerWeights = NA

ddateNorm Normalize the deposition date distance by ddateNorm number of days. Numeric,

default 5.

windowFunction a window function analogous to warpWindowSP (Other compatible window

functions can be found in dtw::dtwWindowingFunctions.)

top.down.mirroring

Will the resulting distance matrix be used for top down alignments? i.e., do you want to mirror the matrix about its anti-diagonal (top-left/bottom-right diago-

nal)?

warn.if.na.in.distance.calc

most dependent functions in this package should be able to deal with NA values encountered in distance calculations. Set this argument to TRUE if you want to

be warned anyways.

.. arguments to the window function, e.g. window.size, window.size.abs, ddate.window.size,

...

Value

A distance matrix of dimension (n x m), where n, m are the number of layers in the query and ref, respectively.

Note

For package developers: dot inputs to the function (i.e., ...) also necessary to keep dtwSP highly flexible and customizable. Dot inputs may contain arguments that remain unused in this function.

Author(s)

fherla

See Also

resampleSPpairs

```
## call function with two snow profiles of unequal lengths, without using a window function:
dMat_noWindow <- distMatSP(SPpairs$A_modeled, SPpairs$A_manual, windowFunction = NA)
graphics::image(dMat_noWindow, main = "Default distance matrix without a warping window")
## compute distance based on grain type alone,
## and additionally disable preferential layer matching:
dMat <- distMatSP(SPpairs$A_modeled, SPpairs$A_manual, windowFunction = NA,</pre>
                  dims = "gtype", weights = 1, prefLayerWeights = NA)
graphics::image(dMat,
              main = "Only based on grain type, and without preferential layer matching")
## enable preferential layer matching:
dMat <- distMatSP(SPpairs$A_modeled, SPpairs$A_manual, windowFunction = NA)</pre>
graphics::image(dMat,
                main = "... with preferential layer matching")
## using a warping window:
dMat <- distMatSP(SPpairs$A_modeled, SPpairs$A_manual, window.size.abs = 50)</pre>
graphics::image(dMat, main = "... and superimposing an absolute warping window of 50 cm")
```

Description

This is the core function of the package and allows to match layers between pairs of snow profiles to align them. It provides a variety of options, where the default values represent a good starting point to the alignment of most generic profiles.

Usage

```
dtwSP(
  query,
  ref,
  open.end = TRUE,
  checkGlobalAlignment = "auto",
  keep.internals = TRUE,
  step.pattern = symmetricP1,
  resamplingRate = 0.5,
  rescale2refHS = FALSE,
  bottom.up = TRUE,
  top.down = TRUE,
  nonMatchedSim = 0,
  nonMatchedThickness = 10,
  simType = "HerlaEtAl2021",
  apply_scalingFactor = FALSE,
)
```

Arguments

query The query snow profile to be warped

ref The reference snow profile to be warped against

open end Is an open end alignment desired? Recommended if profiles will not be rescaled.

checkGlobalAlignment

Do you want to check whether a global alignment performs better (i.e., open. end = FALSE), and use the optimal one of the computed alignments? 'auto' sets to TRUE if simType == "HerlaEtAl2021" and to FALSE otherwise.

keep.internals Append resampled and aligned snow profiles as well as internal parameters to

the output object?

step.pattern The local slope constraint of the warping path, defaults to Sakoe-Chiba's sym-

metric pattern described by a slope factor of P = 1, see dtw::stepPattern

resamplingRate Scalar, numeric resampling rate for a regular depth grid. If the profiles have been

rescaled prior to calling this routine, set to NA. To resample onto the smallest possible mutual (original, likely irregular) depth grid (see Details, bullet point

2.2), set to 'irregularInterfaces'.

rescale2refHS Rescale the query snow height to match the ref snow height?

bottom.up Compute an open.end alignment from the ground upwards?

top.down Compute an open.end alignment from the snow surface downwards?

nonMatchedSim Similarity value [0, 1] for non-matched layers, see simSP. indifference = 0.5, penalty < 0.5

nonMatchedThickness

How strongly should the thicknesses of non-matched layers influence the resulting similarity of the profiles? The smaller this (positive!) value, the more influence; and vice versa. See simSP for more details.

simType

the similarity between two profiles can be computed with different approaches, see simSP

apply_scalingFactor

Setting for simSP in case simType == "layerwise.

... Arguments passed to distMatSP, and dtw e.g.

- dims, weights (defaults specified in distMatSP)
- ddateNorm, numeric, normalize deposition date (default specified in distMatSP)
- windowFunction, default warpWindowSP
- window.size, window.size.abs, ddate.window.size (defaults specified in warpWindowSP)
- gtype_distMat, (default specified in distMatSP), cf. e.g. grainSimilarity_align
- prefLayerWeights, weighting matrix for preferential layer matching, e.g. layerWeightingMat

Details

The individual steps of aligning snow profiles (which can all be managed from this function):

- 1. (optional) **Rescale** the profiles to the same height (cf., scaleSnowHeight)
- 2. **Resample** the profiles onto the same depth grid. 2 different approaches:
 - regular grid with a sampling rate that is provided by the user (recommended, cf., resampleSP).
 - irregular grid that includes all layer interfaces within the two profiles (i.e., set resamplingRate = 'irregularInterfaces') (cf., resampleSPpairs)
- 3. Compute a weighted local cost matrix from multiple layer characteristics (cf., distMatSP)
- 4. **Match the layers** of the profiles with a call to dtw (eponymous R package)
- 5. Align the profiles by **warping** the query profile onto the reference profile (cf., warpSP)
- 6. (optional) If the function has been called with multiple different boundary conditions (global, top-down, or bottom-up alignments), the optimal alignment as determined by simSP or by the DTW distance will be returned.
- 7. (optional) Compute a **similarity score** for the two profiles with **simSP**

Value

An alignment object of class 'dtwSP' is returned. This is essentially a list with various information about the alignment. If keep.internals = TRUE, the resampled snow profiles 'query', 'reference' and 'queryWarped', as well as the 'costMatrix' and 'directionMatrix' are elements of the returned object.

Note

Furthermore, the alignment based on grain type information is currently only possible for specific grain types. These grain types require a pre-defined distance or similarity, such as given by grain-Similarity_align. If your profile contains other grain types, you are required to define your custom grainSimilarity matrix.

The package used to require re-scaling of the profiles to identical snow heights. This requirement has been removed in v1.1.0. Profiles therefore can be resampled onto a regular grid, whilst keeping their original total snow heights. The alignment can then be carried out bottom.up or top.down with a relative or absolute window size. If the profiles have different snow heights and a relative window size is provided, the window size is computed using the larger snow height of the two profiles (e.g., Profile A HS 100 cm, Profile B HS 80 cm; window.size = 0.3 translates to an effective window size of +/- 33 cm). See examples for alignments without prior re-scaling.

Author(s)

fherla

References

Herla, F., Horton, S., Mair, P., & Haegeli, P. (2021). Snow profile alignment and similarity assessment for aggregating, clustering, and evaluating of snowpack model output for avalanche forecasting. Geoscientific Model Development, 14(1), 239–258. https://doi.org/10.5194/gmd-14-239-2021

See Also

plotSPalignment, simSP

```
## Align a modeled and a manual snow profile, primarily based on default settings:
dtwAlignment <- dtwSP(SPpairs$A_modeled, SPpairs$A_manual, open.end = FALSE)</pre>
## check out the resulting dtwSP alignment object:
summary(dtwAlignment)
plotSPalignment(dtwAlignment = dtwAlignment)
plotCostDensitySP(dtwAlignment)
## Align profiles from subsequent days without re-scaling them:
dtwAlignment <- dtwSP(SPpairs$C_day3, SPpairs$C_day1, resamplingRate = 0.5, rescale2refHS = FALSE,</pre>
                      window.size.abs = 30)
## Note, per default both bottom.up and top.down alignments have been considered,
# let's check out which one was suited better:
dtwAlignment$direction # i.e., bottom up
## Check it out visually:
plotSPalignment(dtwAlignment = dtwAlignment,
                mainQu = "3 Days after...", mainRef = "...the reference profile.")
plotCostDensitySP(dtwAlignment, labelHeight = TRUE)
```

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```
extractFromScoringMatrix
```

Extract from Scoring matrix

Description

Vectorized function to efficiently extract elements from scoring matrix of type data.frame

Usage

```
extractFromScoringMatrix(
   ScoringFrame,
   grainType1,
   grainType2,
   profile_handle = NULL
)
```

Arguments

ScoringFrame Scoring matrix of type data.frame (needs to be of symmetric, matrix like format)
grainType1 character vector (yes, vector!) of grain type contained in ScoringFrame
grainType2 same as grainType1
profile_handle character or numeric handle that links a potential warning message to the set of

grain types, if an unknown grain type is encountered (must be of length = 1)

Value

numeric vector of length grainType1 with the elements of ScoringFrame that are defined by grainType1 and grainType2

Author(s)

fherla

flipLayers

Flip snow profile layers top down

Description

Flip snow profile layers top down

Usage

```
flipLayers(x)
```

grainSimilarity_align 23

Arguments

x snowprofile or snowprofileLayers object with layers to be flipped

Value

same object with layers dataframe flipped upside down

Note

only do that with a specific reason (better, don"t do it!), as all functions with snowprofile objects are designed to have the layers increase in height.

grainSimilarity_align Grain Type similarity matrix for DTW alignments

Description

Get the relative similarity matrix of grain types as used for snow profile alignments. This similarity matrix considers the formation and metamorphosis of grain types, as well as quirks of the SNOW-PACK model.

grainSimilarity_evaluate is an analogous matrix designed for assessing the similarity between two profiles, which requires considering the resulting avalanche hazard implications of grain types. The domain is [0, 1] — 1 representing identical grain types. The column 'NA' can be used for unknown grain types.

Usage

```
grainSimilarity_align(triag = TRUE)
```

Arguments

triag

Return a triangular matrix (TRUE, default) or a symmetric matrix (FALSE)

Value

data.frame, either triangular or symmetric

Author(s)

fherla

See Also

grainSimilarity_evaluate, layerWeightingMat

Examples

```
## "similarity" matrix:
simMat <- grainSimilarity_align()
print(simMat)

## equivalent "distance" matrix:
distMat <- sim2dist(grainSimilarity_align())
print(distMat)</pre>
```

grainSimilarity_evaluate

Grain type similarity matrix for evaluation purposes

Description

Similar to grainSimilarity_align, but designed for assessing the similarity between snow profiles based on avalanche hazard relevant characteristics. To be used in combination with simSP.

Usage

```
grainSimilarity_evaluate(triag = TRUE)
```

Arguments

triag

Return a triangular matrix (TRUE, default) or a symmetric matrix (FALSE)

Value

data.frame, either triangular or symmetric

Author(s)

fherla

```
simMat <- grainSimilarity_evaluate()
print(simMat)</pre>
```

hardnessDistance 25

hardnessDistance	Difference in I	Hand Hardness

Description

Calculate the difference (i.e. distance) in hand hardness

Usage

```
hardnessDistance(hardness1, hardness2, normalize = FALSE, absDist = TRUE)
```

Arguments

```
hardness1 character or numeric hand hardness value (1D array)
hardness2 character or numeric hand hardness value (1D array)
normalize Should result be normalized? boolean, default False.
absDist Interested in absolute distance? default True.
```

Value

numeric Hand Hardness Distance

Author(s)

fherla

```
interactive {\it Alignment} \quad {\it Run \ interactive \ alignment \ app}
```

Description

This app allows to interactively explore the alignment of two snowprofiles, which are either given as input to this function, or are uploaded to the app interactively as caaml files. Example profiles are also provided in the app.

Usage

```
interactiveAlignment(query = NaN, ref = NaN)
```

Arguments

```
query an optional query snowprofile ref an optional reference snowprofile
```

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Value

An interactive session will be started

Author(s)

fherla

Examples

```
if (FALSE){ # this example won't be started in package tests.

## start app and choose profiles from within the app:
interactiveAlignment()

## start app with package internal profile data (from `sarp.snowprofile`):
interactiveAlignment(query = SPpairs$A_modeled, ref = SPpairs$A_manual)
}
```

layerWeightingMat

Weighting scheme for preferential layer matching

Description

A matrix, of the same form as grainSimilarity_align, but containing weighting coefficients for preferential layer matching based on the grain types of the layers.

Usage

```
layerWeightingMat(triag = TRUE)
```

Arguments

triag

Return a triangular matrix (TRUE, default) or a symmetric matrix (FALSE)

Value

data.frame, either triangular or symmetric

Author(s)

fherla

```
weightsMat <- layerWeightingMat()
print(weightsMat)</pre>
```

match_with_tolerance 27

Description

Match with numeric tolerance

Usage

```
match_with_tolerance(x, y, d = 2)
```

Arguments

- x numeric vector
 y numeric vector
- d numeric tolerance in form of digits

Value

boolean vector equivalently to match

medoidSP

Find the medoid snow profile among a group of profiles

Description

Find the medoid snowprofile among a group of profiles, based on their pairwise dissimilarity. Either provide a list of snowprofile objects, or a precomputed distance matrix.

If you provide a list of profiles the profiles can optionally be rescaled and resampled before the distance matrix for the medoid calculation is computed. When computing the distance matrix this routine calls distanceSP for *every possible pair* of profiles among the group. During that call the profile pair is aligned by dtwSP and the aligned pair is evaluated by simSP. Note that the number of possible profile pairs grows exponentially with the number of profiles in the group (i.e., $O(n^2)$ calls, where n is the number of profiles in the group).

Usage

```
medoidSP(
  profileList = NULL,
  rescale_resample = TRUE,
  retDistmat = FALSE,
  distmat = NULL,
  verbose = FALSE,
  resamplingRate = 0.5,
  progressbar = require("progress", quietly = TRUE, character.only = TRUE),
  ...
)
```

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Arguments

profileList List of snowprofile objects

rescale_resample

Do you want to uniformly rescale and resample the set of profiles prior to cal-

culating the distance matrix?

retDistmat Do you want to *return* the pairwise distance matrix?

distmat If you have a precalculated distance matrix, provide it here to compute the

medoid on it.

verbose print pairwise distance matrix? default FALSE

resamplingRate The resampling rate that is used for the whole set if rescale_resample = TRUE progressbar Do you want to print a progress bar with recommended package "progress"?

... arguments passed to distanceSP and then further to dtwSP

Details

Note that the pairwise distance matrix is modified within the function call to represent a symmetric distance matrix. That is,, however, not originally the case, since dtwSP(A, B) != dtwSP(B, A). The matrix is therefore made symmetric by setting the similarity between the profiles A and B to $max(\{dtwSP(A, B), dtwSP(B, A)\})$.

Value

If retDistmat = FALSE return the (named) index of the medoid snow profile, otherwise return a list with the elements iMedoid and distmat.

Author(s)

fherla

See Also

reScaleSampleSPx

```
this_example_runs_about_5s <- TRUE
if (!this_example_runs_about_5s) { # exclude from cran checks

## take a list of profiles
grouplist <- SPgroup[1:4]
plot(grouplist, SortMethod = 'unsorted', xticklabels = "originalIndices")

## calulate medoid profile
idxMedoid <- medoidSP(grouplist)
representativeProfile <- grouplist[[idxMedoid]]
plot(representativeProfile, main = paste0("medoid (i.e., profile ", idxMedoid, ")"))
}</pre>
```

mergeIdentLayers 29

mergeIdentLayers

Merge layers with identical properties

Description

Merge adjacent layers that have identical properties, such as grain type, hardness etc..

Usage

```
mergeIdentLayers(x, properties = c("hardness", "gtype"))
```

Arguments

x a snowprofile or snowprofileLayers object with *height* grid information

properties a character array of layer properties that are considered when searching for identical layers (e.g., hardness, gtype, ...)

Value

A new snowprofileLayers object will be returned with the dimensions height, hardness, gtype and any other properties given in 'properties'. Depth and thickness information will be autocalculated. For snowprofile objects, the field 'changes' will be initialized or extended.

Author(s)

fherla

```
## Merge identical layers based on hardness and grain type:
fewerLayers <- mergeIdentLayers(x = SPpairs$A_modeled, properties = c("hardness", "gtype"))
summary(SPpairs$A_modeled)[, c("hs", "nLayers")]
summary(fewerLayers)[, c("hs", "nLayers")]

## compare profile plots before and after merging (i.e., appear identical!)
opar <- par(no.readonly =TRUE)
par(mfrow = c(1, 2))
plot(SPpairs$A_modeled, main = "original", ylab = "Snow height")
plot(fewerLayers, main = "merged layers", ylab = "Snow height")
par(opar)</pre>
```

30 plotCostDensitySP

ogsDistance

Difference in layer ogs

Description

Calculate the difference (i.e. distance) in layer ogs

Usage

```
ogsDistance(ogs1, ogs2, normalize = FALSE, absDist = TRUE)
```

Arguments

ogs1 numeric ogs values (1D array) ogs2 numeric ogs values (1D array)

normalize Should result be normalized? boolean, default False.

absDist Interested in absolute distance? default True.

Value

numeric ogs distance

Author(s)

pbillecocq

plotCostDensitySP

Plot alignment cost density and warping path

Description

Plot alignment cost density and warping path, optionally with the two snow profiles plotted in the margins along the axes.

Usage

```
plotCostDensitySP(
   alignment,
   localCost = TRUE,
   labelHeight = FALSE,
   marginalPros = TRUE,
   pathCol = "black",
   target = FALSE,
   movingTarget = FALSE,
   tlty = "dotted",
```

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```
tlwd = 1.5,
tcol = "black",
tcex = 1.5,
cex.lab = 1,
xlab = NULL,
ylab = NULL,
...
)
```

Arguments

alignment object from dtwSP

localCost plot *local* cost matrix, otherwise plot accumulated global cost.

labelHeight plot axes in units of height (cm) or in unitless (i.e., layer index).

marginalPros plot profiles in margins along the axes. default TRUE

pathCol color of warping path

target draw horizontal & vertical lines from matrix cells to corresponding layers in the

(marginal) profiles. Provide either a vector of length 1 (i.e., index of warping path) or length 2 (i.e., x, y coordinates in terms of layer indices), or a matrix

with 2 columns, specifying (x, y) if you desire multiple 'targets'

movingTarget Do you want to draw the warping path only partially, from the origin to the

target cross? Only possible if target cross is given as a scalar! default = FALSE

(Useful to create GIF animations of a moving path)

tlty target lty
tlwd target lwd
tcol target col
tcex target cex

cex.lab cex of axis labels (cf. par)

xlab x-axis label to change default labeling ylab y-axis label to change default labeling

... forwarded to par

Note

If you can't see the axis labels, try e.g., par(oma = c(3, 3, 0, 0)) before calling the function. Note, there seems to be a problem (only sometimes) with the left-hand labels that are for some reason not plotted parallel to the axis. Also, the routine is not bulletproof with respect to drawing 'targets'. Apologies for any inconveniences!

Author(s)

fherla

32 plotSPalignment

Examples

```
## first align profiles:
dtwAlignment <- dtwSP(SPpairs$A_modeled, SPpairs$A_manual, open.end = FALSE)</pre>
## then plot cost density:
plotCostDensitySP(dtwAlignment)
## label height instead of layer index, and don't show warping path:
plotCostDensitySP(dtwAlignment, labelHeight = TRUE, pathCol = "transparent")
## draw lines to the cell that corresponds to the DH and SH layers
plotCostDensitySP(dtwAlignment, target = c(191, 208))
## "moving target", i.e., draw warping path only from origin to target:
plotCostDensitySP(dtwAlignment, target = 200, movingTarget = TRUE)
plotCostDensitySP(dtwAlignment, target = 266, movingTarget = TRUE)
## A cool GIF can be created from frames like those
create_GIF <- FALSE</pre>
if (create_GIF){
 nPath <- length(dtwAlignment$index1)</pre>
 resolution <- 100 # i.e. super low, make value smaller for smoother GIF
 for (k in seq(1, nPath, by = resolution)) {
   plotCostDensitySP(dtwAlignment, target = k, movingTarget = TRUE)
 }
}
```

plotSPalignment

Align and plot two snow profiles using DTW

Description

This is a plotting routine for the DTW alignment of two snow profiles. Either provide two snow profiles or a dtwSP alignment object. Don't resize the figure, otherwise the plotted alignment segments will not be in correct place anymore! If you need a specific figure size, use grDevices::png with a width/height aspect ratio of about 5/3.

Usage

```
plotSPalignment(
  query,
  ref,
  dtwAlignment = NULL,
  keep.alignment = FALSE,
  plot.costDensity = FALSE,
  plot.warpedQuery = TRUE,
```

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```
label.ddate = FALSE,
  segCol = "gray70",
  segLty = "dotted",
  segLwd = 1,
  segTidy = FALSE,
  segInd = TRUE,
  segEmph = NA,
  cex = 1,
 mainQu = "query",
 mainRef = "reference",
 mainQwarped = "warped query",
  emphasizeLayers_qu = FALSE,
  emphasizeLayers_ref = FALSE,
  failureLayers_qu = FALSE,
  failureLayers_qu_col = "red",
)
```

Arguments

query The query snowprofile to be warped

ref The reference snowprofile to be warped against

dtwAlignment dtwSP object (optional)

keep.alignment Return dtwSP object with resampled query, ref and warped query? boolean

plot.costDensity

First graph, plotCostDensitySP with warping path? boolean, default = FALSE

plot.warpedQuery

plot warped query additionally to query, ref and alignment segments? (i.e. three

pane plot) boolean, default = TRUE

label.ddate Label deposition date in profiles? (Only possible if ddate is given in 'dims', cf

distMatSP)

segCol Color of alignment segments. Passed to gpar, default = "gray70"

segLty Linestyle of alignment segments. Passed to gpar, default = "dotted"

segLwd Linewidth of alignment segments, default = 1

segTidy Tidy up alignment segments, if profiles have not been resampled? boolean,

default FALSE i.e. one segment line per (synthetic) layer interface -> supports visual understanding of alignment, but is also often confusing (segTidy currently

only implemented for tidying up to gtype and hardness interfaces)

segInd Index vector of query layers that will get alignment segments drawn. Note, that

the profiles might get resampled, so pre-calculate your correct indices!

segEmph Index vector of query layers, the alignment segments of which will be em-

phasized (thick and red). Note, that the profiles might get resampled, so pre-

calculate your correct indices!

cex font size, cf. par

mainQu subtitle for query subfigure

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Value

dtw object with the resampled '\$query' and '\$reference', as well as the warped query '\$query-Warped' (only if keep.alignment is TRUE)

Author(s)

fherla

resampleSP 35

resampleSP	Resample snowprofile	

Description

Resample an individual snow profile onto a new depth-grid (i.e., height-grid).

Usage

```
resampleSP(x, h = 0.5, n = NULL)
```

Arguments

Х	snowprofile (or snowprofileLayers) object
h	Sampling rate (i.e. constant depth increment) in centimeters, if given as scalar (default is 0.5 cm). Layers smaller than the scalar h will not be resolved in the resampled profile. Can also be a vector specifying the desired <i>height</i> grid of the resampled profile (useful for non-constant increments). But, be WARNED, that a meaningless grid will produce colorful but senseless output!
n	Number of layers in resampled profile (optional). A given n will overrule a conflicting h!

Details

This routine alters how the layer information of snow profiles is *stored* without changing how the profiles appear. Note, however, that only layer properties that are constant within the individual layers will be resampled: i.e., height, hardness, gtype, ddate will be resampled. However, temperature, for example, will not be resampled, because it is not constant within layers.

Value

resampled snowprofile with the same metadata as x, but resampled "layers". **Note** that only the following layer properties will be resampled: height, hardness, gtype, ddate. If input was a snowprofileLayers object, the output will be, too.

Author(s)

fherla

See Also

resampleSPpairs, mergeIdentLayers

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Examples

```
## (1) constant sampling rate of 1 cm:
profileResampled <- resampleSP(SPpairs$A_modeled, h = 1.0)</pre>
## compare profile summary before and after resampling:
summary(SPpairs$A_modeled)[, c("hs", "nLayers")]
summary(profileResampled)[, c("hs", "nLayers", "changes")]
head(profileResampled$layers)
## compare profile plots before and after resampling (i.e., appear identical!)
opar <- par(no.readonly=TRUE)</pre>
par(mfrow = c(1, 2))
plot(SPpairs$A_modeled, main = "original", ylab = "Snow height")
plot(profileResampled, main = "resampled", ylab = "Snow height")
par(opar)
## (2) resample to 150 layers:
profileResampled <- resampleSP(SPpairs$A_manual, n = 150)</pre>
summary(profileResampled)[, c("hs", "nLayers", "changes")]
head(profileResampled$layers)
## (3) resample onto arbitrarily specified grid
## (issues a warning when the new-grid HS deviates too much from the original HS)
irregularGrid <- c(2 + cumsum(c(0, c(10, 15, 5, 1, 3, 30, 50))), 120)
profileResampled <- resampleSP(SPpairs$A_manual, h = irregularGrid)</pre>
```

resampleSPpairs

Resample a pair of profiles

Description

Resample a pair of (irregularly layered) profiles onto the smallest common height grid. To reduce data storage this routine can be used to merge layers based on specified layer properties, if the input profiles have been resampled earlier, or if due to other reasons existing layers in the individual profiles can be merged. In summary, this routine alters how the layer information of snow profiles is *stored* without changing how the profiles appear.

Usage

```
resampleSPpairs(
  query,
  ref,
  mergeBeforeResampling = FALSE,
  dims = c("gtype", "hardness")
)
```

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Arguments

```
query query snowprofile or snowprofileLayers object

ref reference snowprofile or snowprofileLayers object

mergeBeforeResampling
 shall adjacent layers with identical layer properties be merged? (boolean)

dims layer properties to consider for a potential merging
```

Details

The smallest common height grid is found by

- 1. extract all unique layer interfaces in both profiles
- 2. resample each profile with the above height grid,
 - (!) but set all height values that exceed each's max snow height to that max snow height!

Value

a list with the resampled input objects under the entries query and ref.

Author(s)

fherla

See Also

```
resampleSP, mergeIdentLayers
```

```
## initial situation before mutual resampling:
## two profiles with different snow heights and different numbers of layers
summary(SPpairs$A_manual)[, c("hs", "nLayers")]
summary(SPpairs$A_modeled)[, c("hs", "nLayers")]
opar <- par(no.readonly=TRUE)</pre>
par(mfrow = c(1, 2))
plot(SPpairs$A_manual, main = "Initial profiles before resampling",
     ylab = "Snow height", ymax = 272)
plot(SPpairs$A_modeled, ylab = "Snow height", ymax = 272)
## resampling:
resampledSPlist <- resampleSPpairs(SPpairs$A_manual, SPpairs$A_modeled,</pre>
                                   mergeBeforeResampling = TRUE)
## two profiles with different snow heights and IDENTICAL numbers of layers
summary(resampledSPlist$query)[, c("hs", "nLayers")]
summary(resampledSPlist$ref)[, c("hs", "nLayers")]
plot(resampledSPlist$query, main = "Profiles after resampling",
     ylab = "Snow height", ymax = 272)
plot(resampledSPlist$ref, ylab = "Snow height", ymax = 272)
```

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```
par(opar)
```

reScaleSampleSPx

Rescale and resample a snow profile list

Description

Rescale and resample all snow profiles provided in a list to an identical snow height and resampling rate.

Usage

```
reScaleSampleSPx(SPx, resamplingRate = 0.5, scHeight = median, ...)
```

Arguments

```
SPx list of snowprofile objects

resamplingRate resampling rate, units in centimeters

scHeight a function that calculates the resulting height from the profiles, default median arguments passed on to the function provided in scHeight
```

Value

A list with the first entry \$set storing the rescaled and resampled profile list, the second entry \$maxHS stores the maximum snow height found among the profiles

Author(s)

fherla

```
## let's take the 'SPgroup' object as profile list
SPrr <- reScaleSampleSPx(SPgroup)
print(paste0("max height before rescaling: ", SPrr$maxHS, " cm"))
print(paste0("rescaled height: ", SPrr$set[[1]]$hs, " cm"))
plot(SPrr$set, SortMethod = 'unsorted')</pre>
```

```
return_conceptually_similar_gtypes

*Return conceptually similar grain types*
```

Description

Note, use this function with care. It's a brief helper function for specific usage, not generally applicable! It is, however, sometimes useful for backtracking layers, see backtrackLayers.

Usage

```
return_conceptually_similar_gtypes(gt)
```

Arguments

```
gt a single gtype
```

Value

a character vector of similar gtypes

Examples

```
return_conceptually_similar_gtypes("SH")
return_conceptually_similar_gtypes("MFcr")
return_conceptually_similar_gtypes("RG")
```

rmZeroThicknessLayers Remove layers with a thickness of 'zero cm'

Description

Find layers in a snow profile that are zero cm thick (i.e. height vector stays constant for some layers, even though grain types or hardness may change). Then, either remove those layers, or reset them with the layer characteristics of the lower adjacent (non-zero-thickness) layer. In the latter case (i.e., reset), the number of layers won't change, but those non-zero thickness layers will be made ineffective. This procedure is particularly necessary for warping snow profiles (cf., dtwSP, warpSP).

Usage

```
rmZeroThicknessLayers(x, rm.zero.thickness = TRUE)
```

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Arguments

x A snowprofile or snowprofileLayers object

rm.zero.thickness

Want to remove zero-thickness layers from profile? boolean, default TRUE. If FALSE, those zero-thickness layers will be reset to the lower adjacent (non-zero-thickness) layer; thus, the number of layers won't be changed.

Value

A modified copy of the input object. For snowprofile objects, the field \$changes will be initialized or extended.

Author(s)

fherla

scaleSnowHeight

Scale total height of a snow profile

Description

Scale the snow height of a snow profile either (1) based on another profile, or (2) based on a provided (predetermined) snow height. This function can therefore be used to scale two snow profiles to an identical snow height by scaling the height vector of the (query) profile against the height vector of the (reference) profile.

Usage

```
scaleSnowHeight(query, ref = NA, height = NA)
```

Arguments

query the query snow profile (whose height vector will be scaled)

ref the reference snow profile (whose total snow height will be used as the reference

height for the scaling)

height an optional reference height that can be given instead of the query profile

Value

query profile with scaled height vector

Author(s)

fherla

sim2dist 41

sim2dist

Convert 'similarity' matrix to 'distance' matrix

Description

Convert a 'similarity' matrix to 'distance' matrix. *Note* that the similarity must be normalized (i.e. within [0, 1])

Usage

```
sim2dist(SimMat)
```

Arguments

SimMat

similarity matrix of type data.frame with ranges [0, 1]

Value

copy of input data.frame with similarities inverted to distances (i.e. dist = 1 - sim)

Author(s)

fherla

Examples

```
## the 'swissSimilarityMatrix' as similarity and as distance
graphics::image(as.matrix(swissSimilarityMatrix))
graphics::image(as.matrix(sim2dist(swissSimilarityMatrix)))
```

simSP

Similarity measure between snow profile pairs

Description

This function calculates a similarity measure for two snow profiles that have been aligned onto the same height grid (either through DTW or resampling). If one profile contains more layers than the other one, the layers with a non-matched height represent missing layers and will be treated accordingly. The similarity measure is compatible with top-down alignments and is symmetric with respect to its inputs, i.e. simSP(P1, P2) == simSP(P2, P1). Several different approaches of computing the measure have been implemented by now, see Details below.

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Usage

```
simSP(
  ref,
  qw,
  gtype_distMat = sim2dist(grainSimilarity_evaluate(triag = FALSE)),
  type = "HerlaEtAl2021",
  nonMatchedSim = 0,
  nonMatchedThickness = 10,
  verbose = FALSE,
  returnDF = FALSE,
  apply_scalingFactor = FALSE
)
```

Arguments

type

ref snowprofile object 1

qw snowprofile object 2 (matched layers need to be on the same height grid of ref)

gtype_distMat a distance matrix that stores **distance** information of grain types (*Be careful* to convert similarities, as in grainSimilarity_evaluate, into dissimilarities with

sim2dist.)

the similarity measure can be computed in several different ways (of sophistication). See Details section. Possible choices

• simple

- HerlaEtAl2021 (= simple2)
- tsa_WLdetection & rta_WLdetection
- layerwise & rta_scaling
- remotesensing

nonMatchedSim

sets the similarity value of non-matched layers [0, 1]. "indifference" = 0.5, penalty < 0.5. Note that dtwSP sets the same value and overrides the default value in this function!

nonMatchedThickness

If NA, every unique non-matched layer (i.e., contiguous resampled layers with identical properties) contributes to the overall similarity by 1 x nonMatchedSim. In that case, 5cm of non-matched new snow has the same effect on the overall similarity as 50cm of non-matched new snow. To make the effect of non-matched layers dependent on the layer thickness, provide a positive number to nonMatchedThickness. For nonMatchedThickness = 10, every 10cm of a unique non-matched layer contribute to the overall similarity by 1 x nonMatchedSim. So, 50cm of non-matched new snow would contribute 5 times stronger than 5cm of non-matched new snow. Note that dtwSP sets the same value and overrides the default value in this function!

verbose

print similarities of different grain classes to console? default FALSE

returnDF

additionally return the similarities of the grain classes as data.frame (analogously to verbose); the return object then has the fields \$sim and \$simDF

apply_scalingFactor

Only applicable to type = layerwise: TRUE or FALSE, see Details.

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Details

The first several implementation types (**simple**, **HerlaEtAl2021**, **tsa_WLdetection**, **rta_WLdetection**) represent different flavors of the approach detailed in Herla et al (2021). In essence, they are a simple approach to incorporate avalanche hazard relevant characteristics into the score by computing the score as arithmetic mean of 4 different grain type classes:

• weak layers (wl): SH and DH

• new snow (pp): PP and DF

• crusts (cr): MFcr and IF

• bulk: the rest (i.e., predominantly RG, FC, FCxr — MF falls also in here, will maybe be adjusted in future.)

Additionally, for classes wl and cr, vertical windows are computed to weigh layers more heavily that have no other wl or cr grain types in their neighborhood.

Type **simple** deviates from *simple2* (= *HerlaEtAl2021*) by computing the aforementioned vertical windows based on heuristic depth ranges (i.e., Surface–30cm depth–80cm depth–150cm depth–Ground). It is otherwise identical to the **simple2** type, which computes as many numbers of equidistant vertical windows as number of wl or cr are present in the profile.

Type **tsa_WLdetection** employs a similar approach as *simple*, but it identifies weak layers (wl) based on the Threshold Sum Approach (>= 5 TSA, lemons, German 'Nieten'). Therefore, the original profiles need to contain grain size information, which allows you to pre-compute the lemons for all layers (additionally to the otherwise necessary gain type and hardness information). It is thus more targeted to simulated profiles or detailed manual profiles of very high quality. While the former two types neglect hardness information of wl and cr classes, this type does not. Type **rta_WLdetection** works analogous, but uses RTA instead of TSA and a threshold of >= 0.8.

Unlike the former types, **layerwise** applies no weighting at all if used as per default. That means that the similarity of each individual layer contributes equally to the overall similarity measure. It is, however, very flexible in that any custom scaling factor can be applied to each layer. The resulting similarity score is then computed by

• simSP = sum(sim * scalingFactor) / sum(scalingFactor),

where the denominator ensures that the resulting score will be within [0, 1]. If you want to explore your own scaling approach, both input snow profiles need to contain a column called \$layers\$scalingFactor that store the desired factor. Type **rta_scaling** is a special case of layerwise, where the scaling is determined by the relative lemons of each layer (RTA, see Monti et al 2013). Type **remotesensing** makes use of the layerwise algorithm, but triggers an alternative similarity computation beforehand. Similarity is first computed from density and Optical Grain Size (ogs), and then the layerwise similarity is called upon to compute the global sim score.

NOTE that for all types that include TSA/RTA values, these values need to be computed *prior to aligning* the profiles (and therefore need to be present in the profiles provided to this function!)

Value

Either a scalar similarity between [0, 1] with 1 referring to the two profiles being identical, or (if returnDF is TRUE) a list with the elements \$sim and \$simDF.

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References

Herla, F., Horton, S., Mair, P., & Haegeli, P. (2021). Snow profile alignment and similarity assessment for aggregating, clustering, and evaluating of snowpack model output for avalanche forecasting. Geoscientific Model Development, 14(1), 239–258. https://doi.org/10.5194/gmd-14-239-2021

Monti, F., & Schweizer, J. (2013). A relative difference approach to detect potential weak layers within a snow profile. Proceedings of the 2013 International Snow Science Workshop, Grenoble, France, 339–343. Retrieved from https://arc.lib.montana.edu/snow-science/item.php?id=1861

```
## first align two profiles, then assess the similarity of the aligned profiles
alignment <- dtwSP(SPpairs$A_modeled, SPpairs$A_manual)</pre>
SIM <- simSP(alignment$queryWarped, alignment$reference, verbose = TRUE)
## similarity of identical profiles
SIM <- simSP(alignment$queryWarped, alignment$queryWarped, verbose = TRUE)
## non-matched layers become apparent here:
alignment <- plotSPalignment(SPpairs$C_day1, SPpairs$C_day2, keep.alignment = TRUE,
                             rescale2refHS = FALSE, checkGlobalAlignment = FALSE)
simSP(alignment$queryWarped, alignment$reference, nonMatchedSim = 0.5)
## smaller similarity score due to 'penalty' of non-matched layers:
simSP(alignment$queryWarped, alignment$reference, nonMatchedSim = 0)
## even smaller similarity score due to higher impact of non-matched layer thickness:
simSP(alignment$queryWarped, alignment$reference, nonMatchedSim = 0, nonMatchedThickness = 1)
## detect WL based on lemons (instead of grain type alone):
P1 <- computeTSA(SPpairs$D_generalAlignment1)
P2 <- computeTSA(SPpairs$D_generalAlignment2)
alignment <- dtwSP(P1, P2, simType = "tsa_wldetection")</pre>
# sim based on WL-detection with TSA:
simSP(alignment$queryWarped, alignment$reference, type = "tsa_wldetection", verbose = TRUE)
# sim solely based on grain type, neglecting TSA information
simSP(alignment$queryWarped, alignment$reference, type = "simple", verbose = TRUE)
## RTA scaling type
P1 <- computeRTA(P1)
P2 <- computeRTA(P2)
alignment <- dtwSP(P1, P2, simType = "rta_scaling")</pre>
# sim based on scaling with RTA
simSP(alignment$queryWarped, alignment$reference, type = "rta_scaling")
# sim based on WL-detection with RTA
simSP(alignment$queryWarped, alignment$reference, type = "rta_wldetection")
# sim based on WL-detection with TSA
simSP(alignment$queryWarped, alignment$reference, type = "tsa_wldetection")
## layerwise similarity (i) unscaled...
simSP(alignment$queryWarped, alignment$reference, type = "layerwise", verbose = TRUE)
##... or (ii) with custom scaling factor (example only illustrative)
```

SPgroup2 45

SPgroup2

Additional example set of snow profiles

Description

Additional example set of snow profiles. The main difference to the example data set SPgroup is that SPgroup2 contains various different stability indices.

Usage

SPgroup2

Format

A snowprofileSet

See Also

SPgroup

Examples

```
plot(SPgroup2, SortMethod = "unsorted")
```

SPspacetime

Additional example set of snow profiles

Description

Additional example set of 4 spatially distributed snow profiles for 5 consecutive days, also containing different stability indices.

Usage

SPspacetime

46 warpSP

Format

A snowprofileSet

See Also

SPgroup2

Examples

```
plot(SPspacetime, SortMethod = "elev")
```

swissSimilarityMatrix Similarity Matrix of Snow Grain Types

Description

as defined by Lehning et al (2001). A similarity of 1 represents identity, 0 represents total dissimilarity.

Usage

swissSimilarityMatrix

Format

A data.frame

Examples

```
print(swissSimilarityMatrix)
```

warpSP

Warp one snow profile onto another one

Description

After the DTW alignment of two profiles, the maps between the two profiles can be used to warp one profile onto the other profile. In other words, the layer thicknesses of the warped profile are adjusted to optimally align with the corresponding layers of the other profile.

Usage

```
warpSP(alignment, whom = NA)
```

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Arguments

alignment DTW alignment object from dtwSP containing the two profiles (i.e., called

dtwSP(..., keep.internals = TRUE))

whom to warp? "query" (= "jmin"), "imin", "queryTopDown" (= "jminTop-

Down"), "iminTopDown", "ref"; if 'NA' the routine determines that itself from

the structure of the alignment object. (see Details)

Details

After this procedure, the thickness of some layers can be zero, which leads to the layers disappearing.

This function is automatically called in dtwSP(..., keep.internals = TRUE) to warp the query profile onto the reference profile.

Whom to warp: There exist 8 different options, 4 for warping the query onto the ref and 4 for vice versa. The 4 options for warping the query onto the ref are:

- global alignment / partial alignment where entire query is matched to subsequence of ref ("jmin")
- partial alignment where entire ref is matched to subsequence of query ("imin")
- partial top down alignment where entire query is matched to subsequence of ref ("jminTop-Down")
- partial top down alignment where entire ref is matched to subsequence of query ("iminTop-Down")

For the other case, warping the ref onto the query, only the equivalent of the first option is implemented.

For developers: Including new variables in the output of warped profiles can easily be done by inserting a respective command at the end of this function. There are many example variables added already.

Value

Returns the input alignment object including the element alignment\$queryWarped (or \$reference-Warped), which are the warped snow profiles. The class of the alignment object is altered to "dtwSP", but still inherits "dtw".

Author(s)

fherla

```
## first align profiles
alignment <- dtwSP(SPpairs$A_modeled, SPpairs$A_manual, open.end = FALSE)
## warp reference profile onto query profile:
refWarped <- warpSP(alignment, whom = "ref")$referenceWarped</pre>
```

48 warpWindowSP

```
opar <- par(no.readonly =TRUE)
par(mfrow = c(1, 2))
plot(alignment$query, main = "query")
plot(refWarped, main = "warped reference")
par(opar)</pre>
```

warpWindowSP

Restrict the DTW warping window for snow profiles alignment

Description

Given a matrix, this function sets all elements of the matrix that are outside the so-called warping window to NA. The warping window is a slanted band of constant width around the main diagonal (i.e., *Sakoe-Chiba-*band), and it's size can be controlled with function arguments.

Usage

```
warpWindowSP(
   iw,
   jw,
   iheight,
   jheight,
   iddate,
   jddate,
   profile.size,
   profile.height,
   window.size = 0.3,
   window.size.abs = NA,
   ddate.window.size = Inf,
   ...
)
```

Arguments

1W	matrix of integers indicating their row number (cf., ?row)
jw	matrix of integers indicating their column number (cf., ?col)
iheight	matrix of query height filled into the columns of the matrix
jheight	matrix of ref height filled into the rows of the matrix
iddate	same as iheight, but containing deposition date information (i.e., POSIXct data converted to numeric through matrix call!)
jddate	same as jheight, but containing deposition date information (i.e., POSIXct data converted to numeric through matrix call!)
profile.size	number of layers in the longer one of the two profiles (scalar)
profile.height	snow height of the deeper one of the two profiles (scalar)

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window.size percentage of profile.size or profile.height defining the size of the warping window (i.e., the most restrictive of the two will be applied)

window.size.abs

Instead of a window.size percentage, an absolute value (in cm!) can be provided

ddate.window.size

number of days that exclude layers from the warping window if their deposition dates differ by more than these days

... unused—but important to be able to provide other warping functions to dist-MatSP

See Also

dtw::dtwWindowingFunctions

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