# Package 'TraMineRextras'

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```
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2 Contents

# **Contents**

Index

FraMineRextras-package	3
convert	3
reatedatadiscrete	4
lissindic	5
lissvar.grp	8
FCE_to_TSE	9
group.p	10
HSPELL_to_STS	11
pamward	12
olot.dynin	13
olot.emlt	15
olot.stslist.surv	17
polyads	18
owmode	19
eqauto	20
eqCompare	21
1	24
eqe2stm	27
eqedist	29
1 1	30
eqemlt	32
eqentrans	34
1	35
ic c	37
ic 7	38
1 1	40
1 ,	43
п	45
n i	47
H 2	49
	52
1	53
1	57
11	59
eqstart	62
eqsurv	64
1	65
	66
	68
TSE_to_STS	69

**71** 

TraMineRextras-package

TraMineR Extension

### **Description**

(Version: 0.6.8) Collection of ancillary functions and utilities to be used in conjunction with the 'TraMineR' package for sequence data exploration. Includes, among others, specific functions such as state survival plots, position-wise group-typical states, dynamic sequence indicators, and dissimilarities between event sequences. Also includes contributions by non-members of the TraMineR team such as LRT and BIC for comparing groups and methods for polyadic data.

#### Author(s)

Gilbert Ritschard, Matthias Studer, Reto Buergin

convert Converting between graphical formats

### **Description**

Wrapper function for converting graphics with ImageMagick

#### Usage

```
convert.g(path = NULL, fileroot= "*", from = "pdf",
    to = "png", create.path = TRUE, options = NULL)
```

### **Arguments**

path String: Path to the from graphic files. If NULL (default), the current path is used. fileroot String: Graphic root name; default is "\*" for all files with the from extension.

from String: File type extension specifying the from format. to String: File type extension specifying the to format.

create.path Logical: Should the output files be placed in a to subfolder.

options Additional options to be passed to the ImageMagick mogrify function

#### **Details**

Conversion is done through a call to ImageMagick mogrify function. This means that ImageMagick should be installed on your system. It must also be listed in the path.

For values such as "pdf" and "eps" of the from or to arguments ImageMagick works in conjunction with Gostscript. The latter should, therefore, also be accessible.

ImageMagick is not suited for vector to vector format conversion because it rasterizes the image before the conversion. Therefore, convert.g is not suited too for such conversions.

4 createdatadiscrete

### See Also

```
png, pdf
```

# **Examples**

```
## Not run:
## Convert all .pdf graphics in the "figSW" directory
## into .png files and put the files in a "png" subfolder.
convert.g(path="figSW", from="pdf", to="png")

## Same, but convert to .jpg files.
convert.g(path="figSW", to="jpg")

## convert file "example.jpg" in current path to ".pdf"
## and put it in same folder.
convert.g(fileroot = "example", from = "jpg", create.path=FALSE)

## End(Not run)
```

createdatadiscrete

Transform time to event data into a discrete data format

# **Description**

Transform time to event data (in a specific format, see the details below) into a person-period data format suitable for automatic sequential association rules extraction

### Usage

# Arguments

ids	a vector containing an unique identification number for each case
data	a data frame containing time to event data, with variables containing the durations named as in the vars argument, and those with the censoring indicators named as in the vars argument followed by "ST" (for example column A is duration until event A, and column AST is the censoring indicator). This data frame must contain an unique identification variable named "IDPERS".
vars	a vector with the names of the duration variables
agemin	a data frame with two variables: "IDPERS" for the unique identification variable, and "AGE" for the starting time of the observation
agemax	a data frame with two variables: "IDPERS" for the unique identification variable, and "AGE" for the ending time of the observation
supvar	a vector of variables to add to the resulting person-period data frame

dissindic 5

#### **Details**

The data frame from the data argument must contain two variables for each event: a duration variable that indicates the time when the event occurred, and a status variable that indicates if the event occurred (1) or not (0). If the event did not occur, the observation for this individual will go until the age specified through the agemax argument. Each status variable must have the name of the corresponding duration variable suffixed by "ST". For example, if the duration variable for an event "divorce" is called "div", then the status variable has to be named "divST".

The result from this function is a list with one person-period data frame by event, where the dependent event is different each time. Please see the attached data file and code for an example.

The resulting object is one of the required argument for the seqerulesdisc function that computes the association rules, the hazard ratios and the p-values, using discrete-time regressions. Unlike the method presented in Müller et al. 2010, this function does not use Cox proportional hazard models, but discrete-time regression models with a complementary log-log link function, which gives similar results.

#### Value

a list with one person-period data frame by event, where the dependent event is different each time. Please see the attached data file and code for an example.

### Author(s)

Nicolas S. Müller

### References

Müller, N.S., M. Studer, G. Ritschard et A. Gabadinho (2010), Extraction de règles d'association séquentielle à l'aide de modèles semi-paramétriques à risques proportionnels, *Revue des Nouvelles Technologies de l'Information*, **Vol. E-19**, EGC 2010, pp. 25-36

#### See Also

sequelesdisc to compute the association rules.

# **Examples**

##

dissindic

Sequence marginality and gain indicators.

6 dissindic

### **Description**

The marginality and gain indicators measure the contribution of each observation to a quantitative relationship between a covariate and the sequences using a distance matrix. These indicators allow situating cases according to this quantitative relationship. The marginality indicator quantifies the typicality of each case within each group of the explanatory covariate using a measure of distance between cases and gravity centers. The gain indicator aims to identify cases that are either illustrative of, or discordant with, the quantitative association. It is computed as the contribution of each case to the explained sum of squares, i.e. the sum of squares explained by the covariate.

### Usage

```
dissindic(diss, group, gower = FALSE, squared = FALSE, weights = NULL)
```

### **Arguments**

diss A dissimilarity matrix or a dist object.

group A categorical variable.

gower Logical: Is the dissimilarity matrix already a Gower matrix? squared Logical: Should we square the provided dissimilarities?

weights Optional numerical vector of case weights.

### **Details**

The two indicators are computed within the discrepancy analysis framework (see dissmfacw). The marginality is computed as the "residual" of the discrepancy analysis. A high value means that a sequence (or another object) is far from the center of gravity of its group, i.e. the most typical situation. A low value indicates a sequence (or another object) close to this gravity center.

By combining the "residuals" of the null model (without covariate) and the marginality, we can identify sequences that are better represented when using the covariate than without it. These values measure the contributions of a sequence to the between or explained sums of squares, a concept directly linked to the explained discrepancy. The gain therefore measures the statistical gain of information for each case when taking the covariate into account.

The so-called Gower matrix is a transformation of the distance matrix required to compute the explained, residual and total sum of squares. The distance matrix (argument diss) is automatically transformed to a Gower matrix unless the argument gower=TRUE. This option can be used to avoid multiple transformation of the distance matrix to the Gower matrix which can be time-consuming, but it requires the user to provide a Gower matrix using the diss argument. The function gower\_matrix in the TraMineR package can be used to compute it from a distance matrix.

### Value

A data. frame containing three columns:

group The categorical variable used.

marginality The value of the marginality indicator.

gain The value of the gain indicator.

dissindic 7

### Author(s)

Matthias Studer

#### References

Le Roux, G., M. Studer, A. Bringé, C. Bonvalet (2023). Selecting Qualitative Cases Using Sequence Analysis: A Mixed-Method for In-Depth Understanding of Life Course Trajectories, *Advances in Life Course Research*, doi:10.1016/j.alcr.2023.100530.

Studer, M., G. Ritschard, A. Gabadinho and N. S. Müller (2011). Discrepancy analysis of state sequences, *Sociological Methods and Research*, Vol. 40(3), 471-510, doi:10.1177/0049124111415372.

#### See Also

dissvar to compute a pseudo variance from dissimilarities and for a basic introduction to concepts of discrepancy analysis.

dissassoc to test association between objects represented by their dissimilarities and a covariate. dissmfacw to perform multi-factor analysis of variance from pairwise dissimilarities.

### **Examples**

```
## Defining a state sequence object
data(mvad)
mvad <- mvad[1:100, ] ## Use a subsample to avoid long computation time</pre>
mvad.seq <- seqdef(mvad[, 17:86])</pre>
## Building dissimilarities (any dissimilarity measure can be used)
mvad.ham <- seqdist(mvad.seq, method="HAM")</pre>
## Study association with
di <- dissindic(mvad.ham, group=mvad$gcse5eq)</pre>
## Plot sequences sorted by gain, illustrative trajectories at the top
## and counterexample at the bottom
seqIplot(mvad.seq, group=mvad$gcse5eq, sortv=di$gain)
## Plot sequences sorted by marginality, central trajectories at the bottom
seqIplot(mvad.seq, group=mvad$gcse5eq, sortv=di$marginality)
##Scatterplot of the indicators separated by group value
## as in Le Roux, et al. 2023
par(mfrow=c(1, 2))
## Plot for the "no" category
plot(di$gain[mvad$gcse5eq=="no"], di$marginality[mvad$gcse5eq=="no"], main="No gcseq5q",
xlim=range(di$gain), ylim=range(di$marginality))
abline(h=mean(di$marginality), v=0) ## Draw reference lines
plot(di$gain[mvad$gcse5eq=="yes"], di$marginality[mvad$gcse5eq=="yes"], main="Yes gcseq5q",
xlim=range(di$gain), ylim=range(di$marginality))
abline(h=mean(di$marginality), v=0) ## Draw reference lines
```

8 dissvar.grp

dissvar.grp

Discrepancy by group.

# Description

This function computes the dissimilarity-based discrepancy measure of the groups defined by the group variable. The function is a wrapper for the TraMineR dissvar function.

# Usage

```
dissvar.grp(diss, group=NULL, ...)
```

# **Arguments**

diss a dissimilarity matrix or a dist object.
group group variable. If NULL a single group is assumed.
... additional arguments passed to dissvar.

### **Details**

The function is a wrapper for running dissvar on the different groups defined by the group variable.

# Value

A vector with the group discrepancy measures.

### Note

This function is a pre-release and further testing is still needed, please report any problems.

### Author(s)

Gilbert Ritschard

### See Also

dissvar

# **Examples**

```
## create the biofam.seq state sequence object from the biofam data.
data(biofam)
biofam <- biofam[1:100,]
biofam.seq <- seqdef(biofam[,10:25])
dist <- seqdist(biofam.seq, method="HAM")
## discrepancy based on non-squared dissimilarities</pre>
```

FCE\_to\_TSE 9

```
dissvar.grp(dist, biofam$plingu02)
## square root of discrepancy based on squared dissimilarities
sqrt(dissvar.grp(dist, biofam$plingu02, squared=TRUE))
```

FCE\_to\_TSE

Data conversion from Fixed Column Event format to TSE.

# Description

Data conversion from Fixed Column Event format to TSE.

### Usage

```
FCE_to_TSE(seqdata, id = NULL, cols, eventlist = NULL, firstEvent = NULL)
```

# Arguments

seqdata	data frame or matrix containing event sequence data in FCE format.
id	column containing the identification numbers for the sequences.
cols	Real. Column containing the timing of the event. A missing value is interpreted as a non-occurrence of the event.
eventlist	Event names, specified in the same order as cols argument. If NULL (default), column names are used.
firstEvent	Character. The name of an event to be added at the beginning of each event sequences. This allows to include individuals with no events. If NULL (default), no event is added.

# Details

The usual data format for event sequence is TSE (see sequence).

# Value

```
A data.frame with three columns: "id", "timestamp" and "event".
```

# Note

This function is a pre-release and further testing is still needed, please report any problems.

# Author(s)

Matthias Studer

### See Also

```
seqecreate, seqformat
```

10 group.p

### **Examples**

group.p

Adds proportion of occurrences to each level names

# **Description**

Adds the proportion of occurrences of each level to the corresponding level name.

## Usage

```
group.p(group, weights=NULL)
```

### **Arguments**

group A group variable.

weights Vector of weights of same length as the group variable.

### **Details**

The group variable can be a factor or a numerical variable. In the latter case it is transformed to a factor.

### Author(s)

Gilbert Ritschard

### See Also

seqplot.

HSPELL\_to\_STS 11

# **Examples**

```
data(actcal)
actcal <- actcal[1:100,]
actcal.seq <- seqdef(actcal[,13:24])
seqdplot(actcal.seq, group=group.p(actcal$sex))
levels(group.p(actcal$sex, weights=runif(length(actcal$sex))))</pre>
```

 ${\sf HSPELL\_to\_STS}$ 

Data conversion from Horizontal Spell to STS.

# Description

Convert data from Horizontal Spell to STS.

### Usage

```
HSPELL_to_STS(seqdata, begin, end, status = NULL,
  fixed.status = NULL, pvar = NULL, overwrite = TRUE,
  fillblanks = NULL, tmin = NULL, tmax = NULL, id = NULL,
  endObs = NULL)
```

# Arguments

end0bs

seqdata	a data frame or matrix containing sequence data.
begin	Vector containing the columns (name or number) with the beginning position of each spell.
end	Vector containing the columns (name or number) with the end position of each spell.
status	Vector containing the columns (name or number) with the status of each spell.
fixed.st	atus Default status (for period not covered by any spell.)
pvar	names or numbers of the column containing the 'birth' time.
overwri	e Should the most recent episode overwrite the older one when they overlap? In FALSE, the most recent episode starts from the end of the previous one.
fillblar	ks If not NULL, character used for filling gaps between episodes.
tmin	If sequences are to be defined on a calendar time axis, it defines the starting time of the axis. If set as NULL, the start time is set as the minimum of the 'begin' column in the data.
tmax	If year sequences are wanted, defines the ending year of the sequences. If set to NULL, it is guessed from the data (not so accurately!).
id	column containing the identification numbers for the sequences.

An optional end of observation date. Usefull for retrospective survey.

12 pamward

### **Details**

Hortizontal spell data format has the following caracteristics: - One row per individual - Each spell is specified with three consecutive variables: a begin date, an end date, and the status. - For unused spells, begin and end values should be set as NA.

### Value

A data. frame with the sequence in STS format.

#### Note

This function is a pre-release and further testing is still needed, please report any problems.

#### Author(s)

Matthias Studer

### See Also

See Also segformat.

# **Examples**

pamward

PAM from k-solution of hierarchical clustering

# **Description**

Runs a pam clustering (pam) from the solution in k groups of a hierarchical clustering (agnes).

# Usage

```
pamward(diss, k=3, method="ward", dist)
```

# **Arguments**

diss Distance matrix or object.k Integer. Number of clusters.

method Method for the hierarchical clustering (see agnes).

dist Deprecated. Use diss instead.

plot.dynin 13

### **Details**

The function first runs the hierarchical clustering, retrieves the medoids of the solution for the provided k and uses those medoids as start centers for the pam partitioning.

### Value

An object of class "pam". See pam. object for details.

### Author(s)

Gilbert Ritschard

### See Also

agnes and pam.

# **Examples**

```
library(cluster)
data(actcal)
actcal.seq <- seqdef(actcal[1:200,13:24])
actcal.ham <- seqdist(actcal.seq, method = "HAM")
clust <- pamward(actcal.ham, k = 4)
table(clust$clustering)</pre>
```

plot.dynin

Dynamic index plot

### **Description**

Plot of dynamic (i.e. successive) cross-sectional summaries of an individual index. The successive values of the individual index for all sequences should be collected in a dynin table as produced by seqindic.dyn.

### Usage

```
## S3 method for class 'dynin'
plot(x, fstat=weighted.mean, group=NULL, conf=FALSE,
    main="auto", col=NULL, lty=NULL, lwd=3.5, ylim=NULL,
    ylab=NULL, xlab=NULL, xtlab=NULL, xtstep=NULL, tick.last=NULL,
    with.legend=TRUE, glabels=NULL, legend.pos="topright",
    horiz=FALSE, cex.legend=1, bcol=NULL, na.rm=FALSE, ret=FALSE, ...)
```

14 plot.dynin

# Arguments

X	object of class dynin as produced by seqindic.dyn
fstat	function: summary function to compute the values plotted. Default is weighted.mean with weights taken from the weights attribute of x. When weighted.mean and x has no weights, mean is used instead.
group	factor or discrete vector: group membership; a curve is drawn for each group. If NULL (default) a single curve for the whole set is drawn.
conf	logical or numeric: If logical, should confidence bands be displayed? If numeric, confidence probability. TRUE is equivalent to .95. Applies only when fstat=mean or fstat=weighted.mean.
main	character string: Plot title. Default is "auto" that prints a default title. Set as NULL to suppress the title.
col	color vector. Group line colors. If NULL (default), colors are automatically assigned using qualitative_hcl with the 'Dark 3' palette (see hcl_palettes).
lty	string vector. Group line types (see lines). If NULL (default), types are automatically assigned.
lwd	integer vector: Group line widths (see lines). If NULL (default), set as 3.5.
ylim	pair of numerics defining the range for the y-axis. If left NULL, the limits are defined from the data.
ylab	character string: y axis label.
xlab	character string: x axis label.
xtlab	vector of strings defining the x-axis tick labels. If NULL, column names of the x table are used.
xtstep	integer: step between tick marks on the x-axis. If unspecified, attribute xtstep of the x object is used.
tick.last	logical. Should a tick mark be enforced at the last position on the x-axis? If unspecified, attribute tick.last of the x object is used.
glabels	a vector of strings with the curve labels. If NULL curves are labeled with the levels of the group variable
with.legend	logical: Should the legend be plotted. Default is TRUE.
legend.pos	legend position: default is "topright". Seelegend.
horiz	logical: Should the legend be displayed horizontally. Set as FALSE by default, i.e., legend is displayed vertically.
cex.legend	Scale factor for the legend.
bcol	color vector. For confidence bands. If NULL (default), colors are automatically assigned using qualitative_hcl with the 'Pastel 1' palette (see hcl_palettes).
na.rm	logical. When fstat is mean or weighted.mean, should NA's be stripped before computation? Ignored for any other fstat function.
ret	logical: Should the plotted values be returned?
	additional plot parameters (see par).

plot.emlt 15

#### **Details**

Together with seqindic. dyn this function implements the dynamic sequence analysis approach of *Pelletier et al.* (2020).

The function first computes the summary table using the fstat function. Each row of the summary table is then plotted as a line, except rows that contain NAs. Setting na.rm=TRUE helps sometimes to prevent some NAs in the summary table.

Confidence bands are computed for a confidence level of 95% and assuming a normal distribution.

#### Value

If ret=TRUE, a matrix with the successive group summaries (One row per group) and, when conf=TRUE, the matrices with the lower and upper bounds of the confidence intervals as attributes L.grp and U.grp.

#### Author(s)

Gilbert Ritschard

#### References

Pelletier, D., Bignami-Van Assche, S., & Simard-Gendron, A. (2020) Measuring Life Course Complexity with Dynamic Sequence Analysis, *Social Indicators Research* doi:10.1007/s11205-02002464y.

### See Also

```
See Also seqindic. dyn (with examples)
```

### **Examples**

```
## See examples on 'seqindic.dyn' help page
```

plot.emlt

Emlt Plots

# **Description**

Plots static and dynamic state structure from the outcome of sequent. Two types of plot are proposed: The evolution in time of the correlation between states, and the projection of situations (time-indexed states) on their principal planes.

### Usage

```
## S3 method for class 'emlt'
plot(x, from, to, delay=NULL, leg=TRUE, type="cor", cex=0.7, compx=1, compy=2, ...)
```

plot.emlt

# Arguments

X	an object of class emlt as produced by seqemlt	
type	character string: type of plot to be drawn. Possible types are "cor" for the evolution in time of the correlation between states, and "pca" for the projection of states/situations on their principal planes	
from	vector of state labels: for type "cor", origin state(s) to be considered.	
to	state label: for type "cor", destination state.	
delay	for type "cor", the delay (number of time periods) between "from" and "to" arguments. The correlation between state "from" at time t and "to" at t+delay. By default delay is 0.	
compx	integer: for type "pca" first component, axis x	
compy	integer: for type "pca" second component, axis y	
leg	logical: should the legend be included	
cex	numerical value: amount by which plotting text and symbols should be magnified relative to the default.	
	Arguments to be passed to methods, such as graphical parameters (see par)	

## **Details**

The evolution of the correlation reveals the evolution of the emlt Euclidean distance between the situations (time-indexed states) along the timeframe.

The "pca" components are the principal components of the emlt numerical coordinates of the sequences, see sequents.

# Author(s)

Patrick Rousset and Matthias Studer

# See Also

See also seqemlt (with examples)

# **Examples**

```
## See examples on 'seqemlt' help page
```

plot.stslist.surv 17

plot.stslist.surv

Plot method for objects produced by the seqsurv function

# **Description**

This is the plot method for objects of class *stslist.surv* produced by the seqsurv function.

# Usage

# **Arguments**

x	An object of class stslist.surv as produced by the seqsurv function.
cpal	Vector of colors. Alternative color palette to be used for the drawn lines. The vector should be of length equal to the number of drawn survival curves, i.e., the number of selected states or number of groups when x was obtained with per.state=TRUE. When cpal=NULL, the default colors assigned to the cpal attribute of x are used.
ylab	Optional label for the y axis. If set as NA, no label is displayed. If NULL, a default label is used.
xlab	Optional label for the x axis. If set as NA, no label is displayed. If NULL, a default label is used.
xaxis	Logical. Should the x-axis be plotted. Default is TRUE.
yaxis	Logical. Should the y-axis be plotted. Default is TRUE.
xtstep	Optional interval at which the tick-marks of the x-axis are displayed. For example, with xtstep = 3 a tick-mark is drawn at position 1, 4, 7, etc The display of the corresponding labels depends on the available space and is dealt with automatically. If unspecified, the xtstep attribute of the x object is used.
tick.last	Logical. Should a tick mark be enforced at the last position on the x-axis? If unspecified, the tick.last attribute of the x object is used.
• • •	Further graphical parameters. For more details about the graphical parameter arguments, see plot, plot.default and par.

# **Details**

This is the plot method for the output produced by the seqsurv function, i.e., objects of class *stslist.surv*. It displays the survival curves fitted for states in sequences.

# Author(s)

Matthias Studer, Gilbert Ritschard, Pierre-Alexandre Fonta

polyads polyads

### See Also

```
seqsurv, seqsplot, survfit.
```

# **Examples**

```
## Defining a sequence object with the data in columns 10 to 25
## (family status from age 15 to 30) in the biofam data set
data(biofam)
biofam.lab <- c("Parent", "Left", "Married", "Left+Marr",
"Child", "Left+Child", "Left+Marr+Child", "Divorced")
biofam.seq <- seqdef(biofam, 10:25, labels=biofam.lab)
## State survival plot
biofam.surv <- seqsurv(biofam.seq)
plot(biofam.surv)</pre>
```

polyads

Polyadic data example

# **Description**

This data set contains a data frame with 10 triads. The 10 first rows correspond to the 1st generation members, the next 10 to the second generation members and the last 10 to the third generation members.

# Usage

```
data(polyads)
```

#### **Format**

A data frame with 30 rows and 11 columns.

# **Details**

The first column is the generation variable Gen. The sequences of length 10 are in columns 2 to 11 named X1 to X10.

### Author(s)

Gilbert Ritschard

rowmode 19

rowmode

Modal state of a variable

# Description

Returns the modal state of a variable, e.g., the modal state in a sequence.

# Usage

```
rowmode(v, except = NULL)
```

# **Arguments**

v A numerical or factor variable.

except Vector of values that should be ignored; e.g., set except="\*" to ignore missing

states with default coding.

# **Details**

The function tabulates the variable and returns the most frequent value.

### Value

The modal value

# Author(s)

Gilbert Ritschard

# See Also

table.

# **Examples**

```
data(actcal)
actcal.seq <- seqdef(actcal[1:10,13:24])
actcal.mod <- apply(as.matrix(actcal.seq), 1, rowmode)
head(actcal.mod)</pre>
```

20 sequuto

seqauto

Auto-association between states

# Description

Computes auto-associations of order k = 1 to order, between current states and states lagged by k positions.

# Usage

```
seqauto(seqdata, order = 1, measure = "cv")
```

# **Arguments**

seqdata A state sequence object or a data frame with sequential data in STS format.

order Maximum wanted order of auto-association.

measure Character string. Currently only "cv" (Cramer's v) is accepted.

### **Details**

The function puts the data in "SRS" form by means of the seqformat function.

# Value

A matrix with order rows and two columns: the auto-association and its p-value.

# Warning

Function in development, not fully checked.

### Author(s)

Gilbert Ritschard

# See Also

seqformat

# **Examples**

```
data(biofam)
biofam.seq <- seqdef(biofam[1:100,10:25])
aa <- seqauto(biofam.seq, order=5)
aa</pre>
```

seqCompare 21

seqCompare

BIC and Likelihood ratio test for comparing two groups

### **Description**

Functions seqCompare and dissCompare compute the likelihood ratio test (LRT) and Bayesian Information Criterion (BIC) difference for comparing two groups within each of a series of sets. seqCompare compares two groups of sequences. dissCompare is more general and compares any two groups of data represented by a pairwise dissimilarity matrix. Functions seqBIC and seqLRT are aliases of seqCompare that return only the  $\Delta$ BIC or the LRT.

# Usage

```
seqCompare(seqdata, seqdata2=NULL, group=NULL, set=NULL,
    s=100, seed=36963, stat="all", squared="LRTonly",
    weighted=TRUE, opt=NULL, BFopt=NULL, method, ...)

dissCompare(diss, group, set=NULL,
    s=100, seed=36963, stat="all", squared="LRTonly",
    weighted=TRUE, weights=NULL, BFopt=NULL)

seqLRT(seqdata, seqdata2=NULL, group=NULL, set=NULL, s=100,
    seed=36963, squared="LRTonly", weighted=TRUE, opt=NULL,
    BFopt=NULL, method, ...)

seqBIC(seqdata, seqdata2=NULL, group=NULL, set=NULL, s=100,
    seed=36963, squared="LRTonly", weighted=TRUE, opt=NULL,
    BFopt=NULL, method, ...)
```

## **Arguments**

seqdata	Either a state sequence object of class stslist created with seqdef or a list of state sequence objects, e.g., list(cohort1.seq,cohort2.seq,cohort3.seq).
seqdata2	Either a state sequence object of class stslist or a list of state sequence objects. Must be NULL when group is not NULL. If not NULL, must be of same type than seqdata. See details.
diss	Matrix or distance object. Symmetric pairwise dissimilarities.
group	Vector of length equal to number of sequences in seqdata. A dichotomous grouping variable. See details.
set	Vector of length equal to number of sequences in seqdata. Variable defining the sets. See details.
S	Integer. Default 100. The size of random samples of sequences. When 0, no sampling is done.
seed	Integer. Default 36963. Using the same seed number guarantees the same results each time. Set s=NULL if you don't want to set a seed. The random generator can be chosen with RNGkind.

22 seqCompare

stat String. The requested statistics. One of "LRT", "BIC", or "all"

squared Logical. Should squared distances be used? Can also be "LRTonly", in which

case the distances to the centers are computed using non-squared distances and

LRT is computed with squared distances.

weighted Logical or String. Should weights be taken into account when available? Can

also be "by.group", in which case weights are used and normalized to respect

group sizes.

weights Vector of length equal to number of row of diss. Case weights. If NULL weights

are set as rep(1, nrow(diss)).

opt Integer or NULL. Either 1 or 2. Computation option. When 1, the distance ma-

trix is computed successively for each pair of samples of size s. When 2, the distances are computed only once for each pair of sets of observed sequences and the distances for the samples are extracted from that matrix. When NULL (default), 1 is chosen when the sum of sizes of the two groups is larger than 2\*s

and 2 otherwise.

BFopt Integer or NULL. Either 1 or 2. Applies only when BIC is computed on multiple

samples. When 1 the displayed Bayes Factor (BF) is the averaged BF. When 2, the displayed BF is obtained from the averaged BIC. When NULL both BFs are

displayed.

method String. Method for computing sequence distances. See documentation for sequist.

Additional arguments may be required depending on the method chosen.

. . . Additional arguments passed to seqdist.

### Details

The group and set arguments can only be used when seqdata is an stslist object (a state sequence object).

When seqdata and seqdata2 are both provided, the LRT and Delta BIC statistics are computed for comparing these two sets. In that case both group and set should be left at their default NULL value.

When seqdata is a list of stslist objects, seqdata2 must be a list of the same number of stslist objects.

The default option squared="LRTonly" corresponds to the initial proposition of Liao and Fasang (2021). With that option, the distances to the virtual center are obtained from the pairwise non-squared dissimilarities and the resulting distances to the virtual center are squared when computing the LRT (which is in turn used to compute  $\Delta BIC$ ). With squared=FALSE, non-squared distances are used in both cases, and with squared=TRUE, squared distances are used in both cases.

The computation is based on the pairwise distances between the sequences. The opt argument permits to choose between two strategies. With opt=1, the matrix of distances is computed successively for each pair of samples of size s. When opt=2, the matrix of distances is computed once for the observed sequences and the distances for the samples are extracted from that matrix. Option 2 is often more efficient, especially for distances based on spells. It may be slower for methods such as OM or LCS when the number of observed sequences becomes large.

seqCompare 23

#### Value

Function seqLRT (and seqCompare with the default "LRT" stat value) outputs a matrix with two columns, *LRT* and *p.value*.

LRT This is the likelihood ratio test statistic for comparing the two groups.

p. value This is the upper tail probability associated with the LRT.

Function seqBIC (and seqLRT with the "BIC" stat value) outputs a matrix with two columns, Delta BIC and BF.

Delta BIC This is the difference between BIC values of the model that does not distinguish

the two groups and the model taking account of the distinction.

Bayes Factor This is the Bayes factor associated with the BIC difference.

seqCompare and dissCompare with stat="all" return a matrix with all four indicators.

When set=NULL, the matrix has a single row. Otherwise, there is one row per distinct set value.

### Author(s)

Tim Liao and Gilbert Ritschard

### References

Tim F. Liao & Anette E. Fasang (2021). "Comparing Groups of Life Course Sequences Using the Bayesian Information Criterion and the Likelihood Ratio Test." *Sociological Methodology*, 55 (1), 44-85. doi:10.1177/0081175020959401.

### See Also

dissassoc

# Examples

24 seqcta

```
## Extracting the sequence subsets by language
lev <- levels(lang)</pre>
1 <- length(lev)</pre>
seq.list <- list()</pre>
for (i in 1:1){
 seq.list[[i]] <- biofam.seq[lang==lev[i],]</pre>
}
seqCompare(list(seq.list[[1]]),list(seq.list[[2]]), stat="all", method="OM", sm="CONSTANT")
seqBIC(biofam.seq, group=biofam$sex, method="HAM")
seqLRT(biofam.seq, group=biofam$sex, set=lang, s=80, method="HAM")
```

seqcta

Competing Trajectory Analysis (CTA)

# **Description**

Competing Trajectory Analysis (CTA) aims to simultaneously study the occurrence of an event and the trajectory following it over a pre-defined period of time. The seqcta function convert the data to run the analysis.

# Usage

```
seqcta(seqdata, subseq = 5, time = NULL, event = NULL, initial.state = NULL, covar = NULL)
```

# **Arguments**

seqdata	State sequence object created with the seqdef function. The whole trajectory followed by individuals.
subseq	Numeric. The length of the trajectory following the event to be considered.
time	Numeric. The time of occurrence of the event, can be NA for censored observations. If NULL (default), initial.state should be provided.
event	Logical. Whether the event occur for each trajectory. If NULL (default) and time is provided, NA time values are used to detect censored observations.
initial.state	Character. Only used if time is not provided. If provided, the end of the first spell of the sequence, but only in initial.state state, is used as the event of interest to compute the time argument.
covar	Optional data.frame storing covariates of interest. These covariates are added to the final data set.

seqcta 25

#### **Details**

Competing Trajectory Analysis (CTA) works as follows. First, the sequence following the studied event are clustered. Second, the type of trajectory followed is linked with covariates using a competing risks model.

The seqcta function reorganizes the data to run CTA. More precisely, it provides a person-period data frame until the occurrence of the event. When the event occurs, the trajectory following it is also stored. Covariates specified using the covar arguments are also stored.

The example section below provides a step by step example of the whole procedure.

### Value

A data frame with the following variables

id Numeric. The ID of the observation as the row number in the original sequenta.

time Numeric. The time unit from the beginning of the original sequence until the

occurence of the event.

event Logical. Whether the event occured within this time unit.

lastobs Logical. Whether this is the last observation for an individual observation, cen-

sored or not. This is useful when one want only one row per individual, for

instance to plot survival curves (see example).

T1 until T... The state sequence following the event starting from 1 (time unit after the event)

until subseq time units after the event. Only available for the rows where

event=TRUE.

Optional covariate list

The covariates provided with the covar argument.

## Author(s)

Matthias Studer

#### References

M. Studer, A. C. Liefbroer and J. E. Mooyaart, 2018. Understanding trends in family formation trajectories: An application of Competing Trajectories Analysis (CTA), *Advances in Life Course Research* 36, pp 1-12. doi:10.1016/j.alcr.2018.02.003

### See Also

```
seqsamm, seqsha
```

### **Examples**

```
## Create seq object for biofam data.
data(biofam)
bf.shortlab <- c("P","L","M","LM","C","LC", "LMC", "D")
bf.seq <- seqdef(biofam[,10:25], states=bf.shortlab)</pre>
```

## We focus on the occurrence of ending the first "P" spell and the trajectory that follows

26 seqcta

```
## For the next subseq=5 years
## We also store the covariate sex and birthyr
## seqcta will transform the data to person-period until the end of the first "P" spell
## and store the following trajectory
cta <- seqcta(bf.seq, subseq=5, initial.state="P", covar=biofam[, c("sex", "birthyr")])
summary(cta)
## If the studied event is not a first state of the trajectory
## One can also provide the event using the time and event arguments
## Here we compute the time spent in "P" ourselves before providing it to seqcta
dur <- seqdur(bf.seq)</pre>
## If "P" is the first state, we use the time in this state (dur[, 1])
## Otherwise we use 0 (started immediatly at the beginning)
timeP <- ifelse(bf.seq[, 1]=="P", dur[, 1], 0)</pre>
## The event occured if timeP is inferior to the length of the sequence
## Otherwise they never left their parents.
eventP <- timeP < 16
cta2 <- seqcta(bf.seq, subseq=5, time=timeP, event=eventP, covar=biofam[, c("sex", "birthyr")])
##Identical results
summary(cta2)
## Not run to save computation time
## Not run:
library(survival)
## To plot a survival curve, we only need the last observation for each individual.
## Kaplan Meier curve for the occurrence of the event
ss <- survfit(Surv(time, event)~sex, data=cta, subset=lastobs)</pre>
plot(ss, col=1:2)
## Now we cluster the trajectories following the event
## Therefore we only keep lines where the event occured.
clusterTraj <- seqdef(cta[cta$event, 5:9])</pre>
##Compute distances
diss <- seqdist(clusterTraj, method="HAM")</pre>
##Clustering with pam
library(cluster)
pclust <- pam(diss, diss=TRUE, k=5, cluster.only=TRUE)</pre>
#Naming the clusters
pclustname <- paste("Type", pclust)</pre>
##Plotting the clusters to make senses of them.
seqdplot(clusterTraj, pclustname)
##Now we store back the clustering in the original person-period data
## We start by adding a variable storing "no event" for all lines
cta$traj.event <- "No event"</pre>
## Then we store the type of following trajectory
## only for those having experienced the event
```

seqe2stm 27

```
cta$traj.event[cta$event] <- pclustname</pre>
## Checking the results
summary(cta)
## Now we can estimate a competing risk model
## Several strategies are available.
## Here we use multinomial model on the person period.
library(mlogit)
summary(mlogit(traj.event~1|time+sex, data=cta, shape="wide", reflevel="No event"))
library(nnet)
summary(multinom(traj.event~time+sex+scale(birthyr), data=cta))
## The model can also be estimated with cox regression
## However, we need to estimate one model for each competing risk
## ie. the type of following trajectory in our case.
## Compute the event variable for "Type 1"
cta$eventType1 <- cta$traj.event=="Type 1"</pre>
summary(coxph(Surv(time, eventType1)~sex+scale(birthyr), data=cta, subset=lastobs))
## End(Not run)
```

seqe2stm

Definition of an events to states matrix.

# Description

This function creates a matrix specifying for each state (given in row) to which state we fall when the event given in column happens.

# Usage

```
seqe2stm(events, dropMatrix = NULL, dropList = NULL, firstState = "None")
```

### **Arguments**

events	Character. The vector of all possible events.
dropMatrix	Logical matrix. Specifying the events to forget once a given event has occurred.
dropList	List. Same as dropMatrix but using a list (often more convenient).
firstState	Character. Name of the first state, before any event has occurred.

28 seqe2stm

#### **Details**

This function creates a matrix with in each cell the new state which results when the column event (column name) occurs while we are in the corresponding row state (row name). Such a matrix is required by TSE\_to\_STS. By default, a new state is created for each combination of events that already has occurred.

dropMatrix and dropList allow to specify which events should be "forgotten" once a given event has occurred. For instance, we may want to forget the "marriage" event once the event "divorce" has occurred.

dropMatrix specifies for each event given in row, the previous events, given in column that should be forgotten. dropList uses a list to specify the same thing. The form is list(event1=c(..., events to forget), event2=c(..., events to forget)). See example below.

#### Value

A matrix.

#### Note

This function is a pre-release and further testing is still needed, please report any problems.

### Author(s)

Matthias Studer

### References

Ritschard, G., Gabadinho, A., Studer, M. & Müller, N.S. (2009), "Converting between various sequence representations", In Ras, Z. & Dardzinska, A. (eds) *Advances in Data Management*. Series: *Studies in Computational Intelligence*. Volume 223, pp. 155-175. Berlin: Springer.

### See Also

```
TSE_to_STS
```

### **Examples**

```
## Achieving same result using dropMatrix or dropList.
## List of possible events.
events <- c("marr", "child", "div")
dm <- matrix(FALSE, 3,3, dimnames=list(events, events))
dm[3, ] <- c(TRUE, TRUE, FALSE)
dm[1, 3] <- TRUE
## Using the matrix, we forget "marriage" and "child" events when "divorce" occurs.
## We also forget "divorce" after "marriage" occurs.
print(dm)
stm <- seqe2stm(events, dropMatrix=dm)
## Get same result with the dropList argument.
stmList <- seqe2stm(events, dropList=list("div"=c("marr", "child"), "marr"="div"))</pre>
```

seqedist 29

## test that the results are the same
all.equal(stm, stmList)

seqedist	Distances between event sequences	

# **Description**

Compute Optimal-Matching-like distances between event sequences. The distance measure is described in *Studer et al. 2010*.

# Usage

```
seqedist(seqe, idcost, vparam, interval="No", norm="YujianBo")
```

# Arguments

seqe	An event sequence sequence as defined by the sequence function.
idcost	Insertion/deletion cost of the different events (one entry per element of the event alphabet).
vparam	Positive real. The cost for a one-unit change in the time stamp of an event.
norm	Character. One of "YujianBo" (respects triangle inequality), "max" (maximum distance) or "none".
interval	Character. One of "No" (absolute ages), "previous" (time spent since previous event) or "next" (time spent until next event).

# Value

a distance matrix.

# Author(s)

Matthias Studer

#### References

Studer, M., Müller, N.S., Ritschard, G. & Gabadinho, A. (2010), "Classer, discriminer et visualiser des séquences d'événements", In Extraction et gestion des connaissances (EGC 2010), *Revue des nouvelles technologies de l'information RNTI*. Vol. E-19, pp. 37-48.

Ritschard, G., Bürgin, R., and Studer, M. (2014), "Exploratory Mining of Life Event Histories", In McArdle, J.J. & Ritschard, G. (eds) *Contemporary Issues in Exploratory Data Mining in the Behavioral Sciences*. Series: Quantitative Methodology, pp. 221-253. New York: Routledge.

30 seqedplot

### **Examples**

```
data(actcal.tse)
actcal.seqe <- seqecreate(actcal.tse[1:200,])[1:6,]
## We have 8 different events in this dataset
idcost <- rep(1, 8)
dd <- seqedist(actcal.seqe, idcost=idcost, vparam=.1)</pre>
```

seqedplot

*Graphical representation of a set of events sequences.* 

# Description

This function provides two ways to represent a set of events. The first one (type="survival") plots the survival curves of the first occurrence of each event. The second one (type="hazard") plots the mean counts of each event in the successive periods.

# Usage

```
seqedplot(seqe,
    group=NULL, breaks=20, ages=NULL,
    main="auto", type="survival", ignore=NULL,
with.legend="auto",cex.legend=1,
    use.layout=(!is.null(group) | with.legend!=FALSE), legend.prop=NA,
    rows=NA, cols=NA,
    xaxis="all", xlab="time",
    yaxis="all",
    ylab=ifelse(type=="survival", "survival probability", "mean number of events"),
    cpal=NULL,
    title, withlegend, axes, ...)
```

### **Arguments**

seqe	an event sequence object as defined by the sequence function.
group	Plots one plot for each level of the factor given as argument.
breaks	Number of breaks defining a period.
ages	Two numeric values representing minimum and maximum ages to be represented.
main	String. Title of the graphic. Default is "auto", i.e., group levels. Set as NULL to suppress titles.
type	String. Type of One of "survival" or "hazard". If type="survival", survival curves of the first occurrence of each event are plotted. If type="hazard", mean numbers of each event in the successive periods are plotted.
ignore	Character vector. An optional list of events that should not be plotted.

seqedplot 31

with.legend	Logical or string. Defines if and where the legend of the state colors is plotted. The default value "auto" sets the position of the legend automatically. Other possible values are "right" or FALSE. Obsolete value TRUE is equivalent to "auto".
cex.legend	expansion factor for setting the size of the font for the labels in the legend. The default value is 1. Values lesser than 1 will reduce the size of the font, values greater than 1 will increase the size.
use.layout	if TRUE, layout is used to arrange plots when using the group option or plotting a legend. When layout is activated, the standard par(mfrow=) for arranging plots does not work. With with.legend=FALSE and group=NULL, layout is automatically deactivated and par(mfrow=) can be used.
legend.prop	proportion of the graphic area used for plotting the legend when use.layout=TRUE and with.legend=TRUE. Default value is set according to the place (bottom or right of the graphic area) where the legend is plotted. Values from 0 to 1.
rows	optional arguments to arrange plots when use.layout=TRUE.
cols	optional arguments to arrange plots when use.layout=TRUE.
xaxis	Logical or one of "all" and "bottom". If set as TRUE or "all" (default value) x-axes are drawn on each plot in the graphic. If set as "bottom" and group is used, x-axes are drawn under the plots of the bottom panel only. If FALSE, no x-axis is drawn.
yaxis	Logical or one of "all" or "left". If set as TRUE or "all" (default value) yaxes are drawn on each plot in the graphic. If "left" and group is used, the y-axis is displayed on plots of the left panel only. If FALSE no y-axis is drawn.
xlab	an optional label for the x-axis. If set to NA, no label is drawn.
ylab	an optional label for the y-axis. If set to NA, no label is drawn. Can be a vector of labels by group level.
cpal	Color palette used for the events. If NULL, a new color palette is generated.
title	Deprecated. Use main instead.
withlegend	Deprecated. Use with.legend instead.
axes	Deprecated. Use xaxis instead.
	$Additional\ arguments\ passed\ to\ \verb plot.survfit , \ lines.survfit , \ and/or\ legend.$

# Author(s)

Matthias Studer

# References

Studer, M., Müller, N.S., Ritschard, G. & Gabadinho, A. (2010), "Classer, discriminer et visualiser des séquences d'événements", In Extraction et gestion des connaissances (EGC 2010), *Revue des nouvelles technologies de l'information RNTI*. Vol. E-19, pp. 37-48.

32 seqemlt

### **Examples**

```
data(actcal.tse)
actcal.tse <- actcal.tse[1:200,]
iseq <- unique(actcal.tse$id)
nseq <- length(iseq)
data(actcal)
actcal <- actcal[rownames(actcal) %in% iseq,]
actcal.seqe <- seqecreate(actcal.tse)
seqelength(actcal.seqe) <- rep(12, nseq)
seqedplot(actcal.seqe, type="hazard", breaks=6, group=actcal$sex, lwd=3)
seqedplot(actcal.seqe, type="survival", group=actcal$sex, lwd=3)</pre>
```

segemlt

Euclidean Coordinates for Longitudinal Timelines

# Description

Computes the Euclidean coordinates of sequences from which we get the EMLT distance between sequences introduced in Rousset et al (2012).

### Usage

```
seqemlt(seqdata, a = 1, b = 1, weighted = TRUE)
```

# **Arguments**

seqdata	a state sequence object defined with the seqdef function.
a	optional argument for the weighting mechanism that controls the balancing between short term/long term transitions. The weighting function is $1/(a*s+b)$ where $s$ is the transition step.
b	see argument a.
weighted	Logical: Should weights in the sequence object segdata be used?

### **Details**

The EMLT distance is the sum of the dissimilarity between the pairs of states observed at the successive positions, where the dissimilarity between states is defined at each position as the Chi-squared distance between the normalized vectors of transition probabilities (profiles of situations) from the current state to the next observed states in the sequence. Transition probabilities are down-weighted with the time distance to avoid exaggerated importance of transitions over long periods. The adjustment weight is 1/a \* s + b, where s is the period length over which the transition probability is measured.

The EMLT distance between two sequences is obtained as the Euclidean distance between the returned numerical sequence coordinates. So, providing coord as the data input to any clustering algorithm that uses the Euclidean metric is equivalent to cluster with the EMLT metric.

seqemlt 33

Each time-indexed state is called a situation, and the distance between two states at a position t is derived from the transition probabilities to other observed situations. The distance between any situation and a situation that does not occur is coded as NA. Such non-occurring situations have no influence on the distance between sequences.

The obtained numerical representations of sequences may be used as input to any Euclidean algorithm (clustering algorithms, ...).

#### Value

An object of class emlt with the following components:

coord Matrix with in each row the EMLT numerical coordinates of the corresponding

sequence.

states list of states

situations list of situations (timestamped states)

sit.freq Situation frequencies

sit.transrate matrix of transition probabilities from each situation to future situations

sit.profil profiles of situations. Each profile is the normalized vector of transition proba-

bilities to future situations adjusted to down weight transitions over longer peri-

ods.

sit.cor Matrix of correlations between situations. Two situations are highly correlated

when their profiles are similar (i.e., when their transitions towards future are

similar).

### Author(s)

Patrick Rousset and Matthias Studer. Help page by Gilbert Ritschard.

# References

Rousset, Patrick and Jean-François Giret (2007), Classifying Qualitative Time Series with SOM: The Typology of Career Paths in France, in F. Sandoval, A. Prieto and M. Grana (Eds) *Computational and Ambient Intelligence*, Lecture Notes in Computer science, vol 4507, Berlin: Springer, pp 757-764.

Rousset, Patrick and Jean-François Giret (2008) A longitudinal Analysis of Labour Market Data with SOM, in J. Rabuñal Dopico, J. Dorado, & A. Pazos (Eds.) *Encyclopedia of Artificial Intelligence*, Hershey, PA: Information Science Reference, pp 1029-1035.

Rousset, Patrick, Jean-François Giret and Yvette Grelet (2012) Typologies De Parcours et Dynamique Longitudinale, *Bulletin de méthodologie sociologique*, 114(1), 5-34.

Studer, Matthias and Gilbert Ritschard (2014) A comparative review of sequence dissimilarity measures. LIVES Working Paper, 33 doi:10.12682/lives.22961658.2014.33

#### See Also

plot.emlt

34 seqentrans

### **Examples**

```
data(mvad)
mvad.seq <- seqdef(mvad[1:100, 17:41])</pre>
alphabet(mvad.seq)
head(labels(mvad.seq))
## Computing distance
mvad.emlt <- seqemlt(mvad.seq)</pre>
## typology1 with kmeans in 3 clusters
km <- kmeans(mvad.emlt$coord, 3)</pre>
##Plotting by clusters of typology1
seqdplot(mvad.seq, group=km$cluster)
## typology2: 3 clusters by applying hierarchical ward
## on the centers of the 25 group kmeans solution
km<-kmeans(mvad.emlt$coord, 25)</pre>
hc<-hclust(dist(km$centers, method="euclidean"), method="ward")</pre>
zz<-cutree(hc, k=3)</pre>
##Plotting by clusters of typology2
seqdplot(mvad.seq, group=zz[km$cluster])
## Plotting the evolution of the correlation between states
plot(mvad.emlt, from="employment", to="joblessness", type="cor")
plot(mvad.emlt, from=c("employment", "HE", "school", "FE"), to="joblessness", delay=0, leg=TRUE)
plot(mvad.emlt, from="joblessness", to="employment", delay=6)
plot(mvad.emlt, type="pca", cex=0.4, compx=1, compy=2)
```

segentrans

Event sequence length and number of events

# Description

Adds the sequence length (number of transitions) and total number of events of event sequences to the data attribute of a subseqelist event sequence object.

# Usage

```
seqentrans(fsubseq, avg.occ = FALSE)
```

### **Arguments**

fsubseq A subseqelist object as returned by seqefsub.

avg.occ Logical: Should a column with average number of occurrences also be added?

seqerulesdisc 35

#### **Details**

An event sequence object is an ordered list of transitions, with each transition a non-ordered list of events occurring at a same position.

Average occurrences by sequence may be useful when counts report number of occurrences rather than number of sequences containing the subsequence.

### Value

The object fsubseq updated with the additional information.

### Author(s)

Nicolas Müller and Gilbert Ritschard

# **Examples**

```
data(actcal.tse)
actcal.seqe <- seqecreate(actcal.tse[1:500,])

##Searching for frequent subsequences appearing at least 10 times
fsubseq <- seqefsub(actcal.seqe, min.support=10)
fsubseq <- seqentrans(fsubseq)
## dispaying only those with at least 3 transitions
fsubseq[fsubseq$data$ntrans>2]
## dispaying only those with at least 3 events
fsubseq[fsubseq$data$nevent>2]

## Average occurrences when counting distinct occurrences
ct <- seqeconstraint(count.method="CDIST_0")
fsb <- seqefsub(actcal.seqe, min.support=10, constraint=ct)
fsb <- seqentrans(fsb, avg.occ=TRUE)
fsb[1:10,]</pre>
```

seqerulesdisc

Extract association rules using discrete time regression models

### **Description**

Extract association rules from an object created by the createdatadiscrete function, using discrete time regression models to assess the significance of the extracted rules.

## Usage

```
seqerulesdisc(fsubseq, datadiscr, tsef, pvalue=0.1, supvars=NULL,
    adjust=TRUE, topt=FALSE, link="cloglog", dep=NULL)
```

36 seqerulesdisc

### **Arguments**

fsubseq	an object created using the seqefsub function and that contains the list of subsequences to be tested for an association
datadiscr	the object created by the createdatadiscrete function and that contains the person-period data
tsef	the data frame containing the original time-to-event dataset (equivalent to the data argument of the createdatadiscrete function)
pvalue	the default threshold p-value to consider an association rule as significative, default is $0.1$
supvars	a vector of variable names to be used as control variables in the regression models (experimental)
adjust	if set to TRUE, a Bonferroni adjustment is applied to the p-value threshold specified in the pvalue argument
topt	if set to TRUE, use an alternative algorithm to extract the rules (very experimental); default to FALSE $$
link	the link function to be used in the generalized linear regression model. To obtain hazard ratios, use the complementary log-log link function ("cloglog", as default). The other choice is to use a logit link function ("logit").
dep	if set to NULL, test all possible association rules. If an event is set, the function will only test association rules ending with this event

### **Details**

This function uses a list of subsequences created by the seqefsub function from the TraMineR package and tests each possible association rules. It then shows the association rules whose significance, assessed using a discrete time regression model, is higher than the specified p-value threshold.

The algorithm is described in the Müller et al. (2010) article, even though this function uses a discrete time regression model instead of the Cox regression model described in the article. A more complete explanation of the method is available in Müller (2011).

# Value

a list with one person-period data frame by event, where the dependent event is different each time. Please see the attached data file and code for an example.

# Author(s)

Nicolas S. Müller

### References

Müller, N.S., M. Studer, G. Ritschard et A. Gabadinho (2010), Extraction de règles d'association séquentielle à l'aide de modèles semi-paramétriques à risques proportionnels, *Revue des Nouvelles Technologies de l'Information*, **Vol. E-19**, EGC 2010, pp. 25-36.

seqgen.missing 37

Müller, N.S. (2011), Inégalités sociales et effets cumulés au cours de la vie : concepts et méthodes, *Thèse de doctorat, Faculté des sciences économiques et sociales, Université de Genève*, http://archive-ouverte.unige.ch/unige:17746.

### See Also

createdatadiscrete to create the object needed as the datadiscr argument. seqefsub to create the object needed as the fsubseq argument.

### **Examples**

##

seqgen.missing	Generate random missing elements within a state sequence object

# **Description**

The function assigns missing values (nr attribute of the object, which is "\*" by default) to randomly selected positions in randomly selected cases.

### Usage

# Arguments

seqdata	A state sequence object.
p.cases	Proportion of cases with missing values.
p.left	Proportion of left missing values.
p.gaps	Proportion of gap missing values.
p.right	Proportion of right missing values.
mt.left	Type of left missing. One of "nr" (non response state) or "void"
mt.gaps	Type of gap missing. One of "nr" (non response state) or "void"
mt.right	Type of right missing. One of "nr" (non response state) or "void"

### **Details**

The aim of the function is essentially pedagogical. It may serve to illustrate how results of a sequential analysis may be affected by the presence of random missing states.

States in the sequences are randomly replaced with missing values. For each selected sequence, first, a random proportion between 0 and p.gaps of gaps are randomly inserted, then a random proportion between 0 and p.left of positions from the start of the sequence are set as missing, and finally a random proportion between 0 and p.right of positions from the end of the sequence are set as missing. Left missing values may possibly overlap gaps, and right missing values may overlap gaps and/or right missing values.

38 seggranularity

### Value

The resulting state sequence object.

### Warning

This function needs further testing.

### Author(s)

Gilbert Ritschard

#### See Also

seqdef

# **Examples**

seggranularity

Changing sequence time granularity by aggregating positions

# Description

Changes time granularity of a state sequence object by aggregating successive positions into groups of a user-defined time length.

### Usage

```
seqgranularity(seqdata, tspan = 3, method = "last")
```

seggranularity 39

### **Arguments**

seqdata A state sequence object.

tspan Integer. Number of successive positions grouped together.

method Character string. Aggregating method. One of "first", "first.valid", "last"

 $(default), \, "last.valid", \\ \ \ or \, "mostfreq".$ 

### **Details**

Successive positions are aggregated by group of tspan states. The aggregated state is, depending of the method chosen, either the first ("first"), the first valid ("first.valid"), the last ("last"), the last valid ("last.valid"), or the most frequent ("mostfreq") state of the tspan long spell. The same applies to the last spell, even when it is shorter than tspan.

Methods ("first") and ("last") differ from ("first.valid") and ("last.valid") only when sequences contain missing values and/or have different lengths.

When there are (void or non void) missings, method "mostfreq" replaces each interval with the most frequent valid state on the interval or the missing state when there are no valid state.

End missings are set as void when there are voids in seqdata and as the nr attribute otherwise.

### Value

A stslist object: The compacted state sequence object.

### Author(s)

Matthias Studer and Gilbert Ritschard

# See Also

segdef

```
data(mvad)
mvad <- mvad[1:100,]
mvad.seq <- seqdef(mvad[,17:86], xtstep=12)
mvadg.seq <- seqgranularity(mvad.seq, tspan=6, method="first")
par(mfrow=c(2,1))
seqdplot(mvad.seq, with.legend=FALSE, border=NA)
seqdplot(mvadg.seq, with.legend=FALSE)</pre>
```

40 seqimplic

seqimplic	Position wise group-typical states
-----------	------------------------------------

### **Description**

Visualization and identification of the states that best characterize a group of sequences versus the others at each position (time point). The typical states are identified at each position as those for which we have a high implication strength to be in when belonging to the group.

# Usage

```
seqimplic(seqdata, group, with.missing = FALSE, weighted = TRUE, na.rm = TRUE)
## S3 method for class 'seqimplic'
plot(x, main = NULL, ylim = NULL, xaxis = TRUE,
    ylab = "Implication", yaxis = TRUE, axes = "all", xtlab = NULL,
    xtstep = NULL, tick.last = NULL, cex.axis = 1, with.legend = "auto",
    ltext = NULL, cex.legend = 1, legend.prop = NA, rows = NA, cols = NA,
    conf.level = 0.95, lwd = 1, only.levels = NULL, ...)
## S3 method for class 'seqimplic'
print(x, xtstep = NULL, tick.last = NULL, round = NULL,
    conf.level = NULL, na.print = "", ...)
```

### **Arguments**

seqdata	a state sequence object (see seqdef).
group	a factor giving the group membership of each sequence in seqdata.
with.missing	Logical. If FALSE (default), missing values are discarded. If TRUE, missing values are coded as a specific state.
weighted	Logical. If TRUE (default), the implicative strength of the rules are computed using the weights assigned to the state sequence object (see seqdef). Set as FALSE to ignore the weights.
na.rm	Logical. If TRUE (default), observations with missing values on the group variable are discarded. If FALSE, the missing group value defines a specific group.
x	A sequence of typical state object as generated by seqimplic.
xtstep	Integer. Optional interval at which the tick-marks and labels of the x-axis are displayed. For example, with xtstep=3 a tick-mark is drawn at position 1, 4, 7, etc The display of the corresponding labels depends on the available space and is dealt with automatically. If unspecified, the xtstep attribute of the x object is used.
tick.last	Logical. Should a tick mark be enforced at the last position on the x-axis? If unspecified, the tick.last attribute of the x object is used.
main	title for the graphic. Default is NULL.
ylim	the y limits of the plot.
xaxis	Logical. Should the x-axis (time) be plotted?.

seqimplic 41

ylab	Optional label for the y-axis. If set as NA, no label is drawn.
yaxis	Logical. Should the y axis be plotted?. When set as TRUE, sequence indexes are displayed.
axes	If set as "all" (default value) x-axes are drawn for each plot in the graphic. If set as "bottom", axes are drawn only under the plots located at the bottom of the graphic area. If FALSE, no x-axis is drawn.
xtlab	optional labels for the x-axis ticks labels. If unspecified, the column names of the sequence object are used (see seqdef).
cex.axis	expansion factor for setting the size of the font for the axis labels and names. The default value is 1. Values lesser than 1 will reduce the size of the font, values greater than 1 will increase the size.
with.legend	One of "auto" (default), "right" or FALSE. Defines if and where the legend of the state colors is plotted. With "auto" sets the position of the legend is set automatically. The obsolete value TRUE is equivalent to "auto".
ltext	optional description of the states to appear in the legend. Must be a vector of character strings with number of elements equal to the size of the alphabet. If unspecified, the label attribute of the seqdata sequence object is used (see seqdef).
cex.legend	expansion factor for setting the size of the font for the labels in the legend. The default value is 1. Values smaller than 1 reduce the size of the font, values greater than 1 increase the size.
legend.prop	Proportion (between 0 and 1) of the graphic area used for plotting the legend when use.layout=TRUE and withlegend=TRUE. The default value is set according to the place (bottom or right of the graphic area) where the legend is plotted.
rows, cols	optional arguments to arrange plots when use.layout=TRUE.
lwd	The line width, a positive number. See lines
only.levels	Optional list of levels of the group variable to be plotted. By default all levels are plotted.
round	Optional number of decimals when printing a seqimplic object.
conf.level	Confidence levels thresholds (default is 0.95).
na.print	Character string (or NULL) used for NA values in printed output, see print.default.
	further arguments passed to print.default (for print method) or lines (for plot method).

# **Details**

The seqimplic function builds an object with the position wise typical states. It can be used to visualize or identify the differences between each group of trajectories and the other ones. It presents at each time point the typical states of a subpopulation (for instance women, as opposed to men). A state at a given time point is considered to be typical of a group if the rule "Being in this group implies to be in that state at this time point" is relevant according to the implicative statistic.

The implicative statistic assesses the statistical relevance of a rule of the form "A implies B" (Gras et al., 2008). It does so by measuring the gap between the expected and observed numbers of

42 seqimplic

counter examples. The rule is considered to be strongly implicative if we observe much less counter examples than expected under the independence assumption. This gap and its significance are computed using adjusted residuals of a contingency table with continuity correction as proposed by Ritschard (2005). In order to improve the readability of the graphs, we use here the opposite of the implicative statistic, which is highly negative for significant rules. The statistic  $I(A \to B)$  measuring the relevance of the rule "A implies B" reads as follows:

$$I(A \to B) = -\frac{n_{\bar{B}A} + 0.5 - n_{\bar{B}A}^e}{\sqrt{n_{\bar{B}A}^e (n_{B.}/n)(1 - n_{.A}/n)}}$$

Where  $n_{\bar{B}A}$  is the observed number of counter-examples,  $n_{\bar{B}A}^e$  the expected number of counter-examples under the independence assumption,  $n_B$  the number of times that B is observed,  $n_{.A}$  the number of times that A is observed and n the total number of cases.

The plot function can be used to visualize the results. It produces a separate plot for each level of the group variable. In each plot, it presents at each time point t, the relevance of the rule "Being in this group implies to be in this state at this time point". The higher the plotted value, the higher the relevance of the rule. The horizontal dashed lines indicate the confidence thresholds. A rule is considered as statistically significant at the 5% level if it exceeds the 95% confidence horizontal line. The strength of rules with negative implicative statistic are not displayed because they have no meaningful interpretation.

### Value

seqimplic returns a "seqimplic" object that can be plotted and printed. The values of the implicative statistics at each time point are in the element indices of the object.

### Author(s)

Matthias Studer.

# References

Studer, Matthias (2015), Comment: On the Use of Globally Interdependent Multiple Sequence Analysis, Sociological Methodology 45, doi:10.1177/0081175015588095.

Gras, Régis and Kuntz, Pascale. (2008), An overview of the Statistical Implicative Analysis (SIA) development, in Gras, R., Suzuki, E., Guillet, F. and Spagnolo, F. (eds), Statistical Implicative Analysis: Theory and application, Series Studies in Computational Intelligence, Vol 127, Berlin: Springer-Verlag, pp 11-40.

Ritschard, G. (2005). De l'usage de la statistique implicative dans les arbres de classification. In Gras, R., Spagnolo, F., and David, J., editors, Actes des Troisièmes Rencontres Internationale ASI Analyse Statistique Implicative, volume Secondo supplemento al N.15 of Quaderni di Ricerca in Didattica, pages 305–314. Università a degli Studi di Palermo, Palermo.

# **Examples**

data(mvad)

## Building a state sequence object
mvad.seq <- seqdef(mvad, 17:86)</pre>

seqindic.dyn 43

```
## Sequence of typical states
mvad.si.gcse5eq <- seqimplic(mvad.seq, group=mvad$gcse5eq)
##Plotting the typical states
plot(mvad.si.gcse5eq, lwd=3, conf.level=c(0.95, 0.99))
## Printing the results
print(mvad.si.gcse5eq, xtstep=12)</pre>
```

seqindic.dyn

Dynamic index

# Description

Dynamic (i.e. successive) values of an individual index. For each sequence, the values of the selected index is computed on sliding windows.

# Usage

```
seqindic.dyn(seqdata, indic="cplx", window.size = .2, sliding=TRUE,
    wstep=1, with.missing=FALSE, endmiss.as.void=FALSE, silent.indic=TRUE, ...)
```

# **Arguments**

	seqdata	state sequence object (stslist) as produced by seqdef
	indic	character string: the individual index. Can be any value supported by seqindic except index group names.
	window.size	integer or real. If an integer $> 1$ , window size in number of positions. If real number in the range $]0,1)$ , the window size is set as that proportion of the length of the longest sequence.
	sliding	logical: Should indic be computed on sliding windows? If FALSE, windows are incremented starting with a window of size window. $size$ .
	wstep	integer: size of position gap between successive windows.
	with.missing	logical. Should the missing state be treated as a state of the alphabet?
endmiss.as.void		
		logical. When with.missing=FALSE, should missings at end of windows be considered as voids, i.e. should the sequence end before end missings? When FALSE (default), the index is set as NA for windows that end with a void and, when TRUE, for windows that end with a void or a missing. Ignored when with.missing=TRUE.
	silent.indic	logical. Should messages issued during computation of indic be suppressed?
		additional arguments passed to seqindic

44 seqindic.dyn

### **Details**

The function implements the dynamic sequence analysis approach of *Pelletier et al.* (2020) and generalizes the method to any of the over 20 indicators provided by seqindic.

The values of the indic index are computed for each sequence either on sliding windows of size window.size or on incremental windows starting from a first window of size window.size.

Column names refer to the end the windows.

#### Value

A matrix of class dynin with attributes xtstep, tick.last, weights, window.size, sliding, and indic. The first three as well as the row and column names are taken from seqdata.

There are print and plot methods for dynin objects. See plot. dynin.

### Author(s)

Gilbert Ritschard

### References

Pelletier, D., Bignami-Van Assche, S., & Simard-Gendron, A. (2020) Measuring Life Course Complexity with Dynamic Sequence Analysis, *Social Indicators Research* doi:10.1007/s11205-02002464y.

### See Also

```
seqindic, plot.dynin
```

```
data(actcal)
cases <- 1:100
actcal <- actcal[cases,] ## Here, only a subset
actcal.seq <- seqdef(actcal[,13:24], alphabet=c('A','B','C','D'))</pre>
## Using windows every three positions
a.dyn <- seqindic.dyn(actcal.seq, indic='cplx', with.missing=FALSE, wstep=3)</pre>
plot(a.dyn, group=actcal[cases,'sex'])
## Trimmed mean (to illustrate fstat with specific arguments)
plot(a.dyn, group=actcal[cases,'sex'], fstat=function(x)mean(x, trim=.02))
## Incremental windows
ai.dyn <- seqindic.dyn(actcal.seq, indic='cplx', with.missing=FALSE, wstep=3,
                sliding=FALSE)
plot(ai.dyn, group=actcal[cases,'sex'])
#############
## Sequences of different lengths, and with missing values and weights
s.ex1 <- seqdef(ex1[,1:13],weights=ex1[,"weights"])</pre>
```

seqplot.rf 45

```
seqlength(s.ex1)
seqlength(s.ex1, with.missing=FALSE)
group <- c(1,1,1,2,2,2,2)

ind.d <- seqindic.dyn(s.ex1, indic='cplx', with.missing=FALSE)
plot(ind.d, group=group, fstat=weighted.mean, na.rm=TRUE, conf=TRUE, ret=TRUE)

## Treating 'missing' as a regular state
ind.dm <- seqindic.dyn(s.ex1, indic='cplx', with.missing=TRUE)
plot(ind.dm, group=group, fstat=weighted.mean, na.rm=TRUE, conf=TRUE, ret=TRUE)</pre>
```

segplot.rf

Relative Frequency Sequence Plots.

### **Description**

Relative Frequency Sequence Plots (RFS plots) plot a selection of representative sequences as sequence index plots (see seqIplot). RFS plots proceed in several steps. First a set of sequences is ordered according to a substantively meaningful principle, e.g. according to their score on the first factor derived by applying Multidimensional scaling (default) or a user defined sorting variable, such as the timing of a transition of interest. Then the sorted set of sequences is partitioned in to k equal sized frequency groups. For each frequency group the medoid sequence is selected as a representative. The selected representatives are plotted as sequence index plots. RFS plots come with an additional distance-to-medoid box plot that visualizes the distances of all sequences in a frequency group to their respective medoid. Further, an R2 and F-statistic are given that indicate how well the selected medoids represent a given set of sequences.

### Usage

```
seqplot.rf(seqdata, k = floor(nrow(seqdata)/10), diss, sortv = NULL,
   ylab=NA, yaxis=FALSE, main=NULL, which.plot="both",
   grp.meth = "first", ...)
```

### **Arguments**

seqdata	a state sequence object created with the seqdef function.
k	integer: Number of groupings (frequency groups?)
diss	$matrix\ of\ pairwise\ dissimilarities\ between\ sequences\ in\ seqdata\ (see\ seqdist).$
sortv	an optional sorting variable that may be used to compute the frequency groups. If $NULL$ , an MDS is used. Ties are randomly ordered.
ylab	string. An optional label for the y-axis. If set as NA (default), no label is drawn. Does not apply to which.plot="both".
yaxis	logical. Controls whether a y-axis is plotted. When set as TRUE, the indexes of the sequences are displayed.
main	main graphic title. Default is NULL.

46 seqplot.rf

which.plot string. One of "both", "medoids", "diss.to.med". When "medoids", only

the index plot of the medoids is displayed, when "diss.to.med", the grouped boxplots of the distances to the medoids is displayed, and when "both" a com-

bined plot of the two is displayed.

grp.meth character string. One of "first" or "random". When the number of sequences

is not a multiple of the number groups, which groups should have their size augmented by one unit? If "first", the first groups, and if "random" a random

selection of groups.

... arguments passed to seqplot.

#### **Details**

RFS plots are useful to visualize large sets of sequences that cannot be plotted with sequence index plots due to overplotting (see seqIplot). Due to the partitioning into equal sized frequency groups each selected sequence represents an equal portion of the original sample and thereby visually maintains the relative proportion of different types of sequences along the sorting criterion. The ideal number of k fequency groups depends on the size of the original sample and the empirical distribution of the sequences. The larger the sample and the more heterogeneous the sequences, higher numbers of k will be advisable. To avoid overplotting k should generally not be higher than 200.

Note that distance-to-medoid plots are meaningful only if there are at least 5-10 sequences in each frequency group. The distance-to-medoid plot is not only a quality criterion of how well the medoids represent a respective frequency group. They also provide additional substantive information about how large the variation of sequences is at a given location of the ordered sequences (see Fasang and Liao 2014).

Since ties in sortv or mds are randomly ordered (see argument ties.method="random" of function rank), one has to set the seed to reproduce exactly the same plot (see set.seed).

Unlike other TraMineR plotting functions, seqplot.rf() ignores the weights and does not support the group argument.

### Value

A vector with the group membership (medoid of the group) of each sequence.

### Author(s)

Matthias Studer, Anette Eva Fasang, Tim Liao, and Gilbert Ritschard.

### References

Fasang, Anette Eva and Tim F. Liao. 2014. "Visualizing Sequences in the Social Sciences: Relative Frequency Sequence Plots." Sociological Methods & Research 43(4):643-676.

### See Also

See also seqplot, seqrf, seqrep.

seqplot.tentrop 47

# **Examples**

```
## Defining a sequence object with the data in columns 10 to 25
## (family status from age 15 to 30) in the biofam data set
data(biofam)
biofam.lab <- c("Parent", "Left", "Married", "Left+Marr",</pre>
"Child", "Left+Child", "Left+Marr+Child", "Divorced")
## Here, we use only 100 cases selected such that all elements
## of the alphabet be present.
## (More cases and a larger k would be necessary to get a meaningful example.)
biofam.seq <- seqdef(biofam[501:600, ], 10:25, labels=biofam.lab)</pre>
diss <- seqdist(biofam.seq, method="LCS")</pre>
## Using 12 groups and default MDS sorting
segplot.rf(biofam.seg, diss=diss, k=12,
  main="Non meaningful example (n=100)")
## With a user specified sorting variable
## Here time spent in parental home: there are ties
## We set a seed because of random order in ties
set.seed(123)
parentTime <- seqistatd(biofam.seq)[, 1]</pre>
seqplot.rf(biofam.seq, diss=diss, k=12, sortv=parentTime,
  main="Sorted by parent time")
```

seqplot.tentrop

Plotting superposed transversal-entropy curves

### **Description**

Functions to plot, in a same frame, transversal-entropy curves by group or multiple curves.

# Usage

```
seqplot.tentrop(seqdata, group, main="auto",
    col=NULL, lty=NULL, lwd=3.5, ylim=NULL, xtlab=NULL,
    xtstep=NULL, tick.last=NULL, with.legend=TRUE, glabels=NULL,
    legend.pos="topright", horiz=FALSE, cex.legend=1, ...)

seqplot.tentrop.m(seqdata.list, main="auto",
    col=NULL, lty=NULL, lwd=3.5, ylim=NULL, xtlab=NULL,
    xtstep=NULL, tick.last=NULL, with.legend=TRUE,
    glabels=names(seqdata.list),
    legend.pos="topright", horiz=FALSE, cex.legend=1, ...)
```

48 seqplot.tentrop

### **Arguments**

seqdata a state sequence object (see seqdef). seqdata.list a list of state sequence objects. a factor giving the group membership of each sequence in seqdata. group a character string giving the title of the graphic; if "auto", a default title is main printed. a vector of colors for the different curves. col a vector of line types for the different curves. See lines. lty numeric or vector of numerics: width of curve lines. See lines. lwd pair of numerics defining the range for the y-axis. If left NULL, the limits are ylim defined from the data. xtlab vector of strings defining the x-axis tick labels. integer: step between tick marks on the x-axis. If unspecified, attribute xtstep xtstep of (first) seqdata is used. tick.last logical. Should a tick mark be enforced at the last position on the x-axis? If unspecified, attribute tick.last of (first) seqdata is used. glabels a vector of strings with the curve labels. If NULL curves are labeled with the levels of the group variable or, for seqplot.tentrop.m, as seq1, seq2, ... with.legend logical: Should the legend be plotted. Default is TRUE. legend position: default is "topright". Seelegend. legend.pos horiz logical: Should the legend be displayed horizontally. Set as FALSE by default, i.e., legend is displayed vertically. cex.legend Scale factor for the legend.

### **Details**

Use seqplot.tentrop to plot curves of transversal entropies by groups of a same set of sequences, e.g. professional careers by sex.

additional plot parameters (see par).

Use seqplot.tentrop.m to plot multiple curves of transversal entropies corresponding to different sets of sequences such as sequences describing cohabitational and sequences describing occupational trajectories.

### Value

Number k of survival curves plotted.

# See Also

seqHtplot for an alternative way of plotting the transversal entropies and seqstatd to get the values of the entropies.

seqpolyads 49

# **Examples**

seqpolyads

Measuring the Degree of Within-Polyadic Similarities

### **Description**

The function computes measures of the degree of similarities within polyadic member sequences compared to randomly assigned polyadic member sequences.

# Usage

```
seqpolyads(seqlist, a=1, method="HAM", ...,
   w=rep(1,ncol(combn(1:length(seqlist),2))),
   s=36963, T=1000, core=1, replace=TRUE, weighted=TRUE,
   with.missing=FALSE, rand.weight.type=1, role.weights=NULL,
   show.time=FALSE)
```

# **Arguments**

seqlist	A list of $J>1$ state sequence stslist objects. List of input sets (polyads) of polyadic sequences. The state sequence objects in the list must all have the
	same number $N$ of sequences and the same alphabet. The state sequence objects should be created with seqdef and the list with list. E.g., list(gen1.seq,gen2.seq,gen3.seq).
a	Integer, 1 or 2. Random generation mechanism. If 1 (default), draws from the observed set of sequences, and if 2, in addition random draws of states from each randomly drawn sequence. See reference below for detail.
method	String. Method for computing sequence distances. See seqdist. Additional arguments may be required depending on the method chosen.

50 seqpolyads

... Additional arguments passed to segdist

Integer. Default 36963. Using the same seed number on the same computer

guarantees the same results each time. Set s=NULL if you don't want to set a

seed. The random generator can be chosen with RNGkind.

w Integer vector. Default 1. The weights assigned to between-polyadic member

sets in the weight matrix. For example, for dyadic sequences, no weight is necessary and the distance computation takes on the default of 1. For triadic sequences, there are three weights between the first and the second members, the first and the third members, and the second and the third members, in a

row-wise order. See reference below.

T Integer. Default 1,000. The number of randomized computations.

core Integer. Default 1. Number of cores for the computation. When greater than 1,

the procedure utilizes parallel processing.

replace Logical. When a=2, should state sampling in each sequence be done with re-

placement? Default is TRUE. Ignored when a=1.

weighted Logical. Should we account for the weights when present in the sequence ob-

jects? See details. Default is TRUE.

with missing Logical. Should the missing state be considered as a regular state? Default is

FALSE.

rand.weight.type

Integer, 1 or 2. Ignored when weighted=FALSE. If 1 (default), weight of each randomized polyad is the average of original weights of its members. If 2, member weights are adjusted by dividing them by the sum of weights of all drawn

or weights are adjusted by dividing them by the sum of weights of

members of the same type.

role.weights NULL or vector of non-negative weights of same length as the list seqlist.

Ignored when weighted=FALSE. If non null, role weights for determining the

weights of the randomized polyads.

show. time Logical. Should elapsed time be displayed? Default is FALSE.

# **Details**

The function computes the polyadic distance of the observed polyads, i.e., the (weighted) mean of the pairwise distances between members of the polyad. In addition, the following statistics are computed:

The U statistic measures for each observed polyad by how much its polyadic distance differs from the mean polyadic distance of T randomized polyads. U.tp is the p-value for a two-tailed t-test of the U statistic.

The V statistic is, for each observed polyad, the proportion of T randomized polyads that have a greater polyadic distance. V.95 is an associated dummy that takes value 1 when the proportion V is greater than 95% and 0 otherwise.

When the sequence objects in seqlist have weights and weighted=TRUE, the randomized sequences are sampled using the weights of the first element in the list. Each member of an observed polyad is supposed to have the same weight. This does not hold for the randomized polyads that are obtained by sampling their members independently. The weights of each randomized sequence is set as the average of the weights of its members. When role weights are provided with

seqpolyads 51

role.weights, a weighted average of the member weights is used. When rand.weight.type=1, original member weights are used. When rand.weight.type=2, the weights of randomly selected members are adjusted by the sum of weights of all randomly drawn members of the same type.

When core > 1, the function uses the doParallel package for parallel computation.

#### Value

The function outputs a list of seven objects:

mean.dist	Vector of length 2 with the average observed and random within-polyadic distances.
U	Vector of $N$ number of $U$ statistics (see reference).
U.tp	Vector of $N$ number of $p$ -values for a two-tailed $t$ -test of the $U$ statistic.
V	Vector of N number of V statistics (see reference).
V.95	Vector of $N$ number of 1s or 0s: 1 if a $V$ value is at least 95 percent confident, 0 otherwise.
observed.dist	Vector of within-polyadic distances for the observed polyadic members.
random.dist	Vector of within-polyadic distances for the <i>T</i> number of randomly matched polyadic members.

### Author(s)

Tim Liao and Gilbert Ritschard

### References

Tim F. Liao (2021), "Using Sequence Analysis to Quantify How Strongly Life Courses Are Linked." *Sociological Science* **8**, 48-72, doi:10.15195/v8.a3.

```
data(polyads)
Gen <- polyads$Gen
seqGrandP <- seqdef(polyads[Gen=="1st Generation",2:11])
seqParent <- seqdef(polyads[Gen=="2nd Generation",2:11])
seqChild <- seqdef(polyads[Gen=="3rd Generation",2:11])
Seq <- rbind(seqGrandP,seqParent,seqChild)
slgth <- ncol(Seq)
colnames(Seq) <- 21:30
seqIplot(Seq,group=Gen,idxs=10:1,ylab="Triad",xlab="Age")
seqL <- list(seqGrandP,seqParent,seqChild)
core=1
seqG2.Tim <- seqpolyads(seqL[1:2],method="HAM",a=1,core=core,T=100)
seqG3.Tim <- seqpolyads(seqL,method="HAM",a=1,core=core,T=100)
seqG2.Dur <- seqpolyads(seqL[1:2],method="CHI2",step=slgth,core=core,T=100)
seqG3.Dur <- seqpolyads(seqL,method="CHI2",step=slgth,core=core,T=100)</pre>
```

52 seqrep.grp

seqrep.grp	Finding representative sets by group and their quality statistics.

### **Description**

This function determines representative sequences by group and returns the representatives by group and/or the quality statistics of the representative sets. The function is a wrapper for the TraMineR segrep function.

# Usage

```
seqrep.grp(seqdata, group = NULL, diss = NULL, ret = "stat",
    with.missing = FALSE, mdis, ...)
```

# **Arguments**

seqdata	state sequence object as defined by seqdef.
group	group variable. If NULL a single group is assumed.
diss	dissimilarity matrix. If NULL the "LCS" dissimilarity matrix is computed.
ret	What should be returned? One of "stat" (default), "rep" or "both".
with.missing	Logical. When diss = NULL. Are there missing values in the sequences? Default is FALSE.
mdis	Deprecated. Use diss instead.
	additional arguments passed to segrep.

# Details

The function is a wrapper for running seqrep on the different groups defined by the group variable. When diss = NULL, seqdist is used to compute the dissimilarities.

### Value

```
If ret="stat", a list with the quality statistics for the set of representatives of each group.
```

If ret="rep", a list with the set of representatives of each group. Each element of the list is an object of class stslist.rep returned by seqrep.

If ret="both", a list with the two previous outcomes.

# Author(s)

Gilbert Ritschard

# See Also

segrep

### **Examples**

```
data(biofam)
biofam <- biofam[1:100,]</pre>
biofam.lab <- c("Parent", "Left", "Married", "Left+Marr",</pre>
"Child", "Left+Child", "Left+Marr+Child", "Divorced")
biofam.short <- c("P","L","M","LM","C","LC","LMC","D")
biofam.seq <- seqdef(biofam[,10:25], alphabet=0:7,</pre>
  states=biofam.short, labels=biofam.lab)
dist <- segdist(biofam.seg, method="HAM")</pre>
seqrep.grp(biofam.seq, group=biofam$plingu02, diss=dist, coverage=.2, pradius=.1)
seqrep.grp(biofam.seq, group=biofam$plingu02, diss=dist, ret="rep", coverage=.2, pradius=.1)
## sequences with missing values
data(ex1)
sqex1 \leftarrow seqdef(ex1[,1:13])
nrow(ex1)
gp < - rep(1,7)
gp[5:7] <- 2
seqrep.grp(sqex1, group=gp, method="LCS", ret="rep",
  coverage=.2, pradius=.1, with.missing=TRUE)
```

seqsamm

Sequence Analysis Multistate Model (SAMM) procedure

# **Description**

Sequence Analysis Multistate Model (SAMM) procedure aims to simultaneously study the occurrence of transitions out of (an exit from) a spell in a given state along trajectories and the subsequence (or subtrajectory) immediately following it over a pre-defined period of time. This strategy allows including time-varying covariates in the sequence analysis framework.

# Usage

```
seqsamm(seqdata, sublength, covar = NULL)
## S3 method for class 'SAMM'
plot(x, type="d", ...)
seqsammseq(samm, spell)
seqsammeha(samm, spell, typology, persper = TRUE)
```

# **Arguments**

seqdata State sequence object created with the seqdef function. Sequences representing

any temporal process can be of different length.

sublength Numeric. The length of the subsequence (or subtrajectory) following a transition

to be considered.

Optional data. frame storing covariates of interest. These covariates are added covar to the final data set and can be used in subsequent analyses. A SAMM object produced by segsamm Х A SAMM object produced by segsamm. samm the type of the plot seqplot. Default "d" for state distribution plots (chronotype grams). spel1 Character. The (ending) spell in a given spell to consider. It should be one of the states of the alphabet of the sequences. A spell is a series of time points in the same state. typology Factor or character. The typology of the trajectories out of the specified ending spell generated by a cluster analyses (see example). It should contain one observation per observed ending spell. Logical. If TRUE, the data are returned in person-period format. Otherwise, only persper one line per observed spell is returned.

additional plot parameters passed to segplot.

#### **Details**

The Sequence Analysis Multistate Model (SAMM) procedure works in three steps. First, the substrings over a given time span sublength following any transition out of (exit from) a spell in a given state of the alphabet are extracted from the trajectories seqdata. This step is achieved using the seqsamm function. Each substring starts with the last time-point of the spell in the state. Second, these substrings are clustered using SA to identify typical substrings of medium-term changes. This is achieved separately for each ending spell (see spell argument). The seqsammseq function can be used to retrieve the sub-trajectories following each ending spell. Third, multistate models are used to estimate the chance (or risk) to end a spell in a given spell by distinguishing the type of trajectory that follows (and identified with cluster analysis). This allows estimating the effect of covariates on the chances to start each type of sub-sequence. The seqsammeha prepare the data to estimate the competing risk models for each ending spell. Then usual competing risks models can be used.

Generally speaking, the SAMM procedure allows studying the time spent in each state as well as the patterns of medium-term changes after an exit from that state appears along the trajectories. The example section below provides a step by step example of how to use it.

### Value

A SAMM object (data.frame), storing the reorganized data in person period form. Column variables are:

Numeric. The ID of the observation as the row number in the original sequata.
 Numeric. The time unit of the current observation (from the beginning of the original sequence).
 Numeric. The time of the beginning of the current spell (from the beginning of the original sequence).
 Numeric. The time elapsed from the beginning of the current spell.

transition Logical. Whether a transition out of the current spell occurred within this time unit.

s.1 until s.sublength

The state sequence following the current observation starting from 1 (current state) until sublength time units after the current observation.

lastobs

Logical. Whether this is the last observation of the current spell, censored or not. This is useful when one wants only one row per individual, for instance to plot survival curves (see example).

x object of class SAMM as produced by seqsamm

Optional covariate list

The covariates provided with the covar argument.

The function seqsammseq returns an stslist sequence object (see seqdef) of the trajectories following an ending spell.

The function seqsammeha returns a data. frame storing the person period data of a specific ending spell (see spell argument) considering the given typology as competing risks (see typology argument). Several variables are added to the SAMM objects (see above):

SAMMtypology Factor. The events ending the specified spell using "None" when no event occurs.

SAMM... Logical. A logical vector specifying whether the current observation ends the spell with the following ... type of trajectory.

# Author(s)

Matthias Studer

### References

Studer, M., Struffolino, E., & Fasang, A. E. (2018). Estimating the Relationship between Timevarying Covariates and Trajectories: The Sequence Analysis Multistate Model Procedure. *Sociological Methodology*, 48(1), 103–135. doi:10.1177/0081175017747122

#### See Also

```
seqcta, seqsha
```

### **Examples**

## STEP I: Subsequence extraction

```
## We start by extracting all subsequence of length 6
## We also add covariates from the mvad data frame
mvad.samm <- seqsamm(mvad.seq, 6, covar=mvad[, c("Grammar", "funemp", "gcse5eq")])</pre>
## Plotting the results to visualize the transitions out of each states.
plot(mvad.samm)
## Descriptive information on the seqsamm object
summary(mvad.samm)
### STEP II: Typology of trajectory out of joblessness
## We retrieve the subsequences following a transition out of a joblessness spell
jlseq <- seqsammseq(mvad.samm, "joblessness")</pre>
## Now we create a typology of these subsequences.
## Compute the clustering using LCS
jldist <- seqdist(jlseq, method="LCS")</pre>
## For sake of simplicity, use only 2 groups
library(cluster)
jlclust <- pam(jldist, diss=TRUE, k=2, cluster.only=TRUE)</pre>
## Specify the names of the types in the 2-cluster typology (here joblessness1 or joblessness2).
jltype <- paste0("joblessness", jlclust)</pre>
### STEP III: Competing risks model of trajectories out of joblessness
## Get the data to estimate competing risks models of the kind of trajectory
## out of jobjlessness
## We specify the SAMM object, the ending spell (joblessness) and our typology.
jleha <- seqsammeha(mvad.samm, "joblessness", jltype)</pre>
## Not run:
## Now jleha stores the data in person period format for competing risks
## Discrete time model using multinomial regression
## SAMMtypology and spell.time are variables created and stored in the jleha dataset
library(nnet)
multinom(SAMMtypology~spell.time+Grammar+funemp+gcse5eq, data=jleha)
## We can also have only one line per ending spell
## Plot the results
library(survival)
jleha <- seqsammeha(mvad.samm, "joblessness", jltype, persper=FALSE)</pre>
plot(survfit(Surv(spell.time, SAMMjoblessness1)~1, data=jleha))
## Cox model
summary(coxph(Surv(spell.time, SAMMjoblessness1)~gcse5eq+Grammar+funemp, data=jleha))
## Most of the time methods for recurrent events should be used.
```

seqsha 57

seqsha

Sequence History Analysis (SHA)

# Description

Sequence History Analysis (SHA) aims to study how a previous trajectory is linked to an upcoming event. This procedure relies on sequence analysis typologies to identify the type of previous trajectory as a time-varying covariate and uses discrete-time survival models to estimate its relationship with the upcoming event under consideration.

# Usage

```
seqsha(seqdata, time, event, include.present = FALSE, align.end = FALSE, covar = NULL)
```

# Arguments

	seqdata	State sequence object created with the seqdef function. The whole trajectory followed by individuals.
	time	Numeric. The time of occurrence of the event or the observation time for censored observations.
	event	Logical. Whether the event occured or not (censored observations).
include.present		
		Logical. If FALSE (default), the state occurring at the current time is not included in the previous trajectory.
	align.end	Logical. If FALSE (default), the previous trajectories are aligned at the beginning of the trajectory. If TRUE, the previous trajectories are aligned on the end.
	covar	Optional data.frame storing covariates of interest. These covariates are added to the final data set.

58 seqsha

### **Details**

SHA works in four steps. First, it makes use of a discrete-time representation of the data also known as person-period file. In this format, one observation is generated for each individual at each time point. Second, the previous trajectory at each time point is coded as the sequence of states from the beginning (t=1 in our example) until the previous position t-1. Third, a typology of the previous trajectory is created using standard sequence analysis procedure. This results in a new time-varying covariate coding the type of previous trajectory at each time point. Fourth, the relationship between the previous trajectory and the subsequent event is estimated using a discrete-time model, which includes the past trajectory type as a covariate. In this step, other covariates can be included as well.

The seqsha function can be used to automatically reorganize the data according to the first two steps described above. Then, a standard procedure can be applied on the resulting data set. The example section below provides an example of the whole procedure.

### Value

A data frame with the following variables:

id Numeric. The ID of the observation as the row number in the original sequence.

time Numeric. The time unit from the beginning of the original sequence until the

occurence of the event.

event Logical. Whether the event occured within this time unit.

T1 until T... The state sequence coding the previous trajectory. Columns names depends on

seqdata and aligne.end.

Optional covariate list

The covariates provided with the covar argument.

### Author(s)

Matthias Studer

#### References

Rossignon F., Studer M., Gauthier JA., Le Goff JM. (2018). Sequence History Analysis (SHA): Estimating the Effect of Past Trajectories on an Upcoming Event. In: Ritschard G., Studer M. (eds) *Sequence Analysis and Related Approaches*. Life Course Research and Social Policies, vol 10. Springer: Cham. doi:10.1007/9783319954202\_6

# See Also

```
seqcta, seqsamm
```

```
## Create seq object for biofam data.
data(biofam)
## Reduce the biofam data to accelerate example
biofam <- biofam[100:300,]
bf.shortlab <- c("P","L","M","LM","C","LC", "LMC", "D")</pre>
```

seqsplot 59

```
bf.seq <- seqdef(biofam[,10:25], states=bf.shortlab)</pre>
## We focus on the occurrence the start of a LMC spell
## The code below aims to find when this event occurred (and whether it occurred).
bf.seq2 <- seqrecode(bf.seq, recodes=list(LMC="LMC"), otherwise = "Other")</pre>
dss <- seqdss(bf.seq2)</pre>
## Time until LMC spell
time <- ifelse(dss[, 1]=="LMC", 1, seqdur(bf.seq2)[, 1])</pre>
## Whether the event (start of LMC spell) started or not
event <- dss[, 1]=="LMC"|dss[, 2]=="LMC"
## The seqsha function will convert the data to person period.
## At each time point, the previous trajectory until that point is stored
sha <- seqsha(bf.seq, time, event, covar=biofam[, c("sex", "birthyr")])</pre>
summary(sha)
## Not run:
## Now we build a sequence object for the previous trajectory
previousTraj <- seqdef(sha[, 4:19])</pre>
seqdplot(previousTraj)
## Now we cluster the previous trajectories
##Compute distances using only the dss
## Ensure high sensitivity to ordering of the states
diss <- seqdist(seqdss(previousTraj), method="LCS")</pre>
##Clustering with pam
library(cluster)
pclust <- pam(diss, diss=TRUE, k=4, cluster.only=TRUE)</pre>
#Naming the clusters
sha$pclustname <- factor(paste("Type", pclust))</pre>
##Plotting the clusters to make senses of them.
seqdplot(previousTraj, sha$pclustname)
## Now we use a discrete time model include the type of previous trajectory as covariate.
summary(glm(event~time+pclustname+sex, data=sha, family=binomial))
## End(Not run)
```

seqsplot

Plot survival curves of the states in sequences

### **Description**

High level plot function for state sequence objects that produces survival curves of states in sequences. Usage is similar to the generic seqplot function of TraMineR, with a special handling of the group argument when per.state=TRUE is included in the . . . list.

60 seqsplot

### Usage

```
seqsplot(seqdata, group = NULL, main = "auto",
  cpal = NULL, missing.color = NULL,
  ylab = NULL, yaxis = "all",
  xaxis = "all", xtlab = NULL,
  cex.axis = 1, with.legend = "auto", ltext = NULL, cex.legend = 1,
  use.layout = (!is.null(group) | with.legend != FALSE), legend.prop = NA,
  rows = NA, cols = NA, which.states = NULL,
  title, cex.plot, withlegend, axes, ...)
```

### **Arguments**

seqdata State sequence object created with the seqdef function.

group Grouping variable of length equal to the number of sequences. When per. state

= FALSE (default), a distinct plot is generated for each level of group. When per.state = TRUE, the curves for each group level are drawn in a same plot for

each distinct value of alphabet(seqdata).

main Character string. Title for the graphic. Default is "auto", i.e., group levels or,

when per.state=TRUE, the state labels. If a single string, the string is pasted with the group or state label. Set as NULL to suppress titles. Can also be a vector.

cpal Vector. Color palette used for the states or the groups when per.state=TRUE is

given along the ... list. Default is NULL, in which case the cpal attribute of the seqdata sequence object is used (see seqdef) or the default colors assigned to groups when type="s" and per.state=TRUE. If user specified, a vector of colors of length and order corresponding to alphabet(seqdata) or, if for groups,

the number of levels of the group variable.

missing.color Color for representing missing values inside the sequences. By default, this

color is taken from the missing.color attribute of seqdata.

ylab Character string or vector of strings. Optional label of the y-axis. If a vector,

y-axis label of each group (or state) level. If set as NA, no label is drawn.

yaxis Logical or one of "all" or "left". If set as TRUE or "all" (default), the y-axis

is displayed on all plots. In case of multiple plots (when per.state=TRUE or group is used), if set as "left", the y-axis is only displayed on plots of the left

panel. If FALSE no y-axis is drawn.

xaxis Logical or one of "all" or "bottom". If set as TRUE or "all" (default value)

the x-axis is drawn on each plot in the graphic. In case of multiple plots (when per.state=TRUE or group is used), if set as "bottom", the x-axis is drawn only

under the plots of the bottom panel. If FALSE, no x-axis is drawn.

xtlab Vector of length equal to the number of columns of segdata. Optional labels for

the x-axis tick labels. If unspecified, the column names of the seqdata sequence

object are used (see seqdef).

cex.axis Real. Axis annotation magnification. See par.

with.legend Character string or logical. Defines if and where the legend of the state colors is

plotted. The default value "auto" sets the position of the legend automatically. Other possible value is "right". Obsolete value TRUE is equivalent to "auto".

seqsplot 61

Vector of character strings of length and order corresponding to alphabet(seqdata)

or, when for groups, to the levels of the group variable. Optional description for the color legend. If unspecified, the label attribute of the segdata sequence object is used (see seqdef) or, when for groups, the levels of the group variable. cex.legend Real. Legend magnification. See legend. use.layout Logical. Should layout be used to arrange plots when using the group option or plotting a legend? When layout is activated, the standard 'par(mfrow=...)' for arranging plots does not work. With with.legend=FALSE and group=NULL, layout is automatically deactivated and 'par(mfrow=...)' can be used. Real in range [0,1]. Proportion of the graphic area devoted to the legend plot legend.prop when use.layout=TRUE and with.legend=TRUE. Default value is set according to the place (bottom or right of the graphic area) where the legend is plotted. rows.cols Integers. Number of rows and columns of the plot panel when use.layout=TRUE. which.states Vector of short state names. List of the states for which survival curves should be plotted.

title Deprecated. Use main instead.

cex.plot Deprecated. Use cex.axis instead.

withlegend Deprecated. Use with.legend instead.

axes Deprecated. Use xaxis instead.

Deprecated. Ose xax1s instead.

arguments to be passed to the function called to produce the appropriate statistics and the associated plot method (see details), or other graphical parameters. For example per.spell argument will typically be used for survival plots. Can also include arguments of legend such as bty="n" to suppress the box surrounding the legend.

# **Details**

ltext

This is a specific version of seqplot for type="s". It implements a dedicated handling of the group variable passed as group argument when per.sate=TRUE is included in the . . . list.

Invalid or non observed states are removed the list given as which.states argument. When which.states = NULL, which.states will be defined as the list of states present in the data.

When per.sate=TRUE, a distinct plot is generated for each state in the which.states list and, when a grouping variable is provided, the survival curves of all groups are plotted in each plot.

When per.state=FALSE, a distinct plot is generated for each group and the survival curves of all states listed as which.states are plotted in each plot.

# Author(s)

Gilbert Ritschard (based on TraMineR seqplot function)

# References

Gabadinho, A., G. Ritschard, N. S. Müller and M. Studer (2011). Analyzing and Visualizing State Sequences in R with TraMineR. *Journal of Statistical Software* **40**(4), 1-37.

62 seqstart

### See Also

```
plot.stslist.surv, seqsurv, seqplot,
```

# **Examples**

```
## Creating state sequence objects from example data sets
data(biofam)
biofam.lab <- c("Parent", "Left", "Married", "Left+Marr",</pre>
               "Child", "Left+Child", "Left+Marr+Child", "Divorced")
biofam.short <- c("P","L","M","LM","C","LC","LMC","D")
sple <- 1:200 ## only the first 200 sequences
seqstatl(biofam[sple,10:25]) ## state 4 not present
biofam <- biofam[sple,]</pre>
biofam.seq <- seqdef(biofam[,10:25], alphabet=0:7, states=biofam.short, labels=biofam.lab)
## defining two birth cohorts
biofam$wwii <- factor(biofam$birthyr > 1945,
 labels=c("Born Before End of Word War II", "Born After Word War II"))
## ============
## Plots of state survival curves
## ==========
seqsplot(biofam.seq) ## all states, no group
seqsplot(biofam.seq, group=biofam$wwii, lwd=2) ## all states for each group
seqsplot(biofam.seq, group=biofam$wwii, per.state=TRUE, lwd=2) ## groups for each state
## For a selection of states only
seqsplot(biofam.seq, group=biofam$wwii, which.states= c('LM'), lwd=2)
## changing default color
seqsplot(biofam.seq, group=biofam$wwii, which.states= c('LM'),
 cpal="orange", lwd=2)
seqsplot(biofam.seq, group=biofam$wwii, which.states= c('LM','LMC'),
 cpal=c("orange","brown"), lwd=2)
seqsplot(biofam.seq, group=biofam$wwii, which.states= c('LM','LMC'), per.state=TRUE)
```

seqstart

Aligning sequence data on a new start time.

### Description

Changing the position alignment of a set of sequences.

seqstart 63

### Usage

```
seqstart(seqdata, data.start, new.start, tmin = NULL, tmax = NULL, missing = NA)
```

### **Arguments**

a data frame or matrix containing sequence data.

Integer. The actual starting date of the sequences. In case of sequence-dependent start dates, should be a vector of length equal to the number of rows of seqdata.

Integer. The new starting date. In case of sequence-dependent start dates, should be a vector of length equal to the number of rows of seqdata.

Integer. Start position on new position axis. If NULL, it is guessed from the data.

Integer. End position on new position axis. If NULL, it is guessed from the data.

missing Character. Code used to fill missing data in the new time axis.

### Value

A matrix.

### Note

Warning: This function needs further testing.

### Author(s)

Matthias Studer

64 seqsurv

```
## Changing back from age to calendar time alignment
ageatstart <- startyear - birthyear
seqstart(agedata, data.start=1, new.start=ageatstart)
## Same but dropping right columns filled with NA's
seqstart(agedata, data.start=1, new.start=ageatstart, tmax=5)</pre>
```

segsurv

Generate a survfit object for state survival times.

### Description

The function considers the spells in the different states in sequences and fits survival curves for each state. Alternatively, for a selected state, it fits the survival curves for each level of a stratifying group variable.

Survival curves are fitted with the survfit function.

### Usage

```
seqsurv(seqdata, groups = NULL, per.state = FALSE, state = NULL,
    with.missing = FALSE)
```

### **Arguments**

A sequence stslist object as defined by the seqdef function.

A stratifying group variable of length equal to the number of sequences.

Logical. Should the survival probabilites be computed for the state specified as state argument? If set as TRUE, the state argument must also be specified.

Single state value or a vector. The short name of the state for which to compute survival probabilities. If a vector of state names, survival probabilities are computed for the subset defined by those states. If NULL, survival probabilities are computed for all cases.

#### **Details**

with.missing

The function considers the spells in the different states of a state sequence object (of class stslist).

Logical. Should the missing state be accounted for? (Not yet implemented!)

When per.state = FALSE, it fits survival curves for each state in the alphabet. Currently, per.state = FALSE cannot be used with a non-NULL groups argument. However, seqsplot handles this case.

When per. state = TRUE, the survival curve is fitted only for the state provided as state argument. This is done for each level of the groups variable.

Survival curves are fitted with the survfit function.

# Value

An object of class *stslist.surv*. There is a plot method for such objects.

seqtabstocc 65

### Author(s)

Matthias Studer, Gilbert Ritschard, Pierre-Alexandre Fonta

### See Also

plot.stslist.surv for basic plots of stslist.surv objects and segsplot for more elaborated plots.

# **Examples**

```
## Defining a sequence object with the data in columns 10 to 25
## (family status from age 15 to 30) in the biofam data set
data(biofam)
biofam.lab <- c("Parent", "Left", "Married", "Left+Marr",</pre>
                "Child", "Left+Child", "Left+Marr+Child", "Divorced")
biofam.short <- c("P","L","M","LM","C","LC","LMC","D")
sple <- 500:700 ## want a sample with all elements of the alphabet
##segstatl(biofam[sple, 10:25])
biofam <- biofam[sple,]</pre>
## creating the state sequence object
biofam.seq <- seqdef(biofam[,10:25], alphabet=0:7, states=biofam.short, labels=biofam.lab)
## Spell survival curves
(biofam.surv <- segsurv(biofam.seg))</pre>
## Cohort distinguishing between those born before or after World War II
biofam$wwii <- biofam$birthyr <= 1945</pre>
## Separate survival curves in a given state (here LMC "Left+Marr+Child") according to wwii
(biofam.surv <- seqsurv(biofam.seq, groups=biofam$wwii, per.state=TRUE, state="LMC"))
plot(biofam.surv)
```

seqtabstocc

Frequencies of state co-occurrence patterns

# **Description**

Computes the frequencies of co-occurring state patterns.

# Usage

```
seqtabstocc(seqdata, with.missing=FALSE, ...)
```

### **Arguments**

```
seqdata A state sequence (stslist) object as returned by seqdef.
with.missing Logical. Should the missing state be considered as a regular state?
Additional arguments to be passed to seqtab.
```

66 sortv

### **Details**

The function extracts the list of states co-occurring in each sequence. For each sequence, the co-occurring states are extracted as the sequence of the alphabetically sorted distinct states. The frequencies of the extracted sets of states is then obtained by means of the TraMineR seqtab function.

Returned patterns with a single state correspond to sequences that contain only that state.

#### Value

A stslist.freq object with co-occurrence patterns sorted in descending frequency order.

### Author(s)

Gilbert Ritschard

#### See Also

seqtab

# **Examples**

```
## Creating a sequence object from the first 500 actcal data.
data(actcal)
actcal.seq <- seqdef(actcal[1:500,13:24])</pre>
## 10 most frequent state patterns in the data
seqtabstocc(actcal.seq)
## All state patterns
seqtabstocc(actcal.seq, idxs=0)
## Example with missing states
data(ex1)
ex1 <- ex1[,1:13] ## dropping last weight column
## adding 3 sequences with no gap and left missing state
ex1 <- rbind(ex1,c(rep("A",4),rep(NA,9)))</pre>
ex1 <- rbind(ex1,c(rep("A",4),rep(NA,9)))</pre>
ex1 <- rbind(ex1,rep("A",13))</pre>
s.ex1 <- seqdef(ex1)</pre>
seqtabstocc(s.ex1, with.missing=TRUE)
```

sortv

Sort sequences by states at the successive positions

### **Description**

Returns a sorting vector to sort state sequences in a TraMineR sequence object (seqdef) by the states at the successive positions.

sortv 67

### Usage

```
sorti(seqdata, start = "end", sort.index=TRUE)
sortv(seqdata, start = "end")
```

### **Arguments**

seqdata A state sequence object as returned by seqdef.

start Where to start the sort. One of "beg" (beginning) or "end".

sort.index Should the function return sort indexes? If FALSE, sort values are returned.

### **Details**

With start = "end" (default), the primary sort key is the final state, then the previous one and so on. With start = "beg", the primary sort key is the state at the first position, then at the next one and so on.

With sort.index = FALSE, the function returns a vector of values whose order will determine the wanted order. This should be used as sortv argument of the seqiplot function. With sort.index = TRUE, the function returns a vector of indexes to be used for indexing.

The sortv form is an alias for sorti(..., sort.index = FALSE).

### Value

If sort.index = FALSE, the vector of sorting values. Otherwise the vector of sorting indexes.

# Author(s)

Gilbert Ritschard

### See Also

```
Details about type = "i" or type = "I" in seqplot.
```

```
data(actcal)
actcal.seq <- seqdef(actcal[1:100,13:24])
par(mfrow=c(1,2))
seqIplot(actcal.seq, sortv=sortv(actcal.seq), with.legend = FALSE)
seqIplot(actcal.seq, sortv=sortv(actcal.seq, start="beg"), with.legend = FALSE)
actcal.seq[sorti(actcal.seq)[90:100],]

data(mvad)
mvad.seq <- seqdef(mvad[1:100,17:86])
par(mfrow=c(1,2))
seqIplot(mvad.seq, sortv=sortv(mvad.seq, start="end"), with.legend = FALSE)
seqIplot(mvad.seq, sortv=sortv(mvad.seq, start="beg"), with.legend = FALSE)</pre>
```

68 toPersonPeriod

```
print( mvad.seq[sorti(mvad.seq,start="beg")[90:100],], format="SPS")
```

toPersonPeriod

Converting into person-period format.

# Description

Converts the STS sequences of a state sequence object into person-period format.

### Usage

```
toPersonPeriod(seqdata)
```

# **Arguments**

seqdata

A state sequence object as returned by seqdef.

### Value

A data frame with three columns: id, state and timestamp.

### Author(s)

Matthias Studer

# See Also

```
seqformat.
```

```
data(mvad)
mvad.labels <- c("employment", "further education", "higher education",
        "joblessness", "school", "training")
mvad.scodes <- c("EM", "FE", "HE", "JL", "SC", "TR")
mvad.seq <- seqdef(mvad, 15:86, states = mvad.scodes, labels = mvad.labels)
mvad2 <- toPersonPeriod(mvad.seq[1:20,])</pre>
```

TSE\_to\_STS 69

TSE_to_STS	Converting TSE data into STS (state sequences) format.

### **Description**

Conversion from TSE (time stamped event sequences) vertical format into STS (state sequences) data format.

# Usage

```
TSE_to_STS(seqdata, id = 1, timestamp = 2, event = 3, stm = NULL, tmin = 1,
    tmax = NULL, firstState = "None")
```

### **Arguments**

seqdata	a data frame or matrix with event sequence data in TSE format.
id	Name or index of the column containing the id's of the sequences.
timestamp	Name or index of the column containing the timestamps of the events.
event	Name or index of the column containing the events.
stm	An event to state transition matrix (See seqe2stm).
tmin	Integer. Starting time of the state sequence.

tmax Integer. Starting time of the state sequence.

tmax Integer. Ending time of the state sequence.

firstState Character. The name of the state before any events has occurred.

### **Details**

Convert TSE (time stamped event sequences) data into STS (state sequences) format. By default, the states are defined has the combination of events that already occurred. Different schemes may be specified using function seqe2stm and the stm argument.

# Value

A data.frame with the sequences in STS format.

### Note

This function is a pre-release and further testing is still needed, please report any problems.

# Author(s)

Matthias Studer

### References

Ritschard, G., Gabadinho, A., Studer, M. & Müller, N.S. (2009), "Converting between various sequence representations", In Ras, Z. & Dardzinska, A. (eds) *Advances in Data Management*. Series: *Studies in Computational Intelligence*. Volume 223, pp. 155-175. Berlin: Springer.

70 TSE\_to\_STS

# See Also

See Also seqe2stm, seqformat.

```
data(actcal.tse)
events <- c("PartTime", "NoActivity", "FullTime", "LowPartTime")
## Dropping all previous events.
stm <- seqe2stm(events, dropList=list(PartTime=events[-1],
    NoActivity=events[-2], FullTime=events[-3], LowPartTime=events[-4]))
mysts <- TSE_to_STS(actcal.tse[1:100,], id=1, timestamp=2, event=3,
    stm=stm, tmin=1, tmax=12, firstState="None")</pre>
```

# **Index**

* Datasets	alphabet, 54
polyads, 18	
* Plot	convert, 3
plot.stslist.surv, 17	createdatadiscrete, 4, 36, 37
seqplot.tentrop,47	4: 7 22
seqsplot, 59	dissassoc, 7, 23
* Transversal characteristics	dissCompare (seqCompare), 21
seqplot.tentrop,47	dissindic, 5
* data format	dissmfacw, 6, 7
FCE_to_TSE, 9	dissvar, 7, 8
HSPELL_to_STS, 11	dissvar.grp,8
seqe2stm, 27	FCE_to_TSE, 9
seqstart, 62	102_00_132,
TSE_to_STS, 69	group.p, 10
* event sequences	
seqedplot, 30	hcl_palettes, <i>14</i>
* misc	HSPELL_to_STS, 11
seqedist, 29	
* package	layout, <i>61</i>
TraMineRextras-package, 3	legend, 14, 31, 48, 61
* state sequences	lines, <i>14</i> , <i>41</i> , <i>48</i>
dissvar.grp, 8	lines.survfit, <i>31</i>
seqauto, 20	list, <i>49</i>
seqrep.grp,52	
* survival	pam, 12, 13
seqsurv, 64	pam.object, 13
* utility	pamward, 12
seggen.missing, 37	par, 14, 16, 17, 48, 60, 61
seggranularity, 38	pdf, <i>4</i>
* util	plot, <i>17</i>
convert, 3	plot.default, <i>17</i>
group.p, 10	plot.dynin, 13, 44
pamward, 12	plot.emlt, 15, 33
rowmode, 19	plot.SAMM (seqsamm), 53
seqentrans, 34	plot.seqimplic(seqimplic), 40
seqtabstocc, 65	plot.stslist.surv, 17, 62, 65
sortv, 66	plot.survfit, 31
toPersonPeriod, $68$	png, 4 polyads, 18
agnes, <i>12</i> , <i>13</i>	print.default, 41

72 INDEX

<pre>print.dynin(seqindic.dyn), 43</pre>	set.seed, <i>46</i>
<pre>print.seqimplic (seqimplic), 40</pre>	sorti (sortv), 66
	sortv, 66
rank, 46	survfit, <i>18</i> , <i>64</i>
RNGkind, 21, 50	
rowmode, 19	table, <i>19</i>
. 20	toPersonPeriod, 68
sequito, 20	TraMineRextras
seqBIC (seqCompare), 21	(TraMineRextras-package), 3
seqCompare, 21	TraMineRextras-package, 3
seqcta, 24, 55, 58	TSE_to_STS, 28, 69
seqdef, 21, 24, 32, 38–41, 45, 48, 49, 52, 53,	weighted.mean, <i>14</i>
55, 57, 60, 61, 64–68	weighted.mean, 14
seqdist, 22, 45, 49, 50, 52	
seqe2stm, 27, 69, 70	
sequence seq	
seqedist, 29 seqedplot, 30	
seqefsub, 34, 36, 37	
sequents, 16, 32	
sequentrans, 34	
sequence and sequence are sequenced as sequences are se	
seqformat, 9, 12, 20, 68, 70	
seggen.missing, 37	
seggranularity, 38	
seqHtplot, 48	
seqimplic, 40	
seqindic, 43, 44	
seqindic.dyn, <i>13–15</i> , 43	
seqIplot, <i>45</i> , <i>46</i>	
seqiplot, 67	
seqLRT (seqCompare), 21	
segplot, 10, 46, 54, 62, 67	
seqplot.rf, 45	
seqplot.tentrop, 47	
seqpolyads, 49	
segrep, 46, 52	
seqrep.grp, 52	
seqrf, 46	
seqsamm, 25, 53, 58	
seqsammeha (seqsamm), 53	
seqsammseq (seqsamm), 53	
seqsha, 25, 55, 57	
seqsplot, 18, 59, 64, 65	
seqstart, 62	
seqstatd, 48	
seqsurv, 17, 18, 62, 64	
seqtab, 65, 66	
seqtabstocc, 65	