

Package ‘projections’

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Title Project Future Case Incidence

Version 0.5.2

Description

Provides functions and graphics for projecting daily incidence based on past incidence, and estimates of the serial interval and reproduction number. Projections are based on a branching process using a Poisson-distributed number of new cases per day, similar to the model used for estimating R in 'EpiEstim' or in 'earlyR', and described by Nouvellet et al. (2017) <doi:10.1016/j.epidem.2017.02.012>. The package provides the S3 class 'projections' which extends 'matrix', with accessors and additional helpers for handling, subsetting, merging, or adding these objects, as well as dedicated printing and plotting methods.

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URL <https://www.repidemicsconsortium.org/projections/>

BugReports <https://github.com/reconhub/projections/issues>

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as.matrix.projections *Conversion of projections objects*

Description

These functions convert projections objects into other classes.

Usage

```
## S3 method for class 'projections'
as.matrix(x, ...)
```

```
## S3 method for class 'projections'
as.data.frame(x, ..., long = FALSE)
```

Arguments

x	An projections object, or an object to be converted as projections (see details).
...	Further arguments passed to other functions (no used).
long	A logical indicating if the output data.frame should be 'long', i.e. where a single column containing 'groups' is added in case of data computed on several groups.

Author(s)

Thibaut Jombart <thibautjombart@gmail.com>

See Also

the [project](#) function to generate the 'projections' objects.

build_projections *Constructor for projections objects*

Description

This function builds a valid projections object from some input simulations and dates.

Usage

```
build_projections(x, dates = NULL, cumulative = FALSE, order_dates = TRUE)
```

Arguments

x	A matrix of simulated incidence stored as integers, where rows correspond to dates and columns to simulations.
dates	A vector of dates containing one value per row in x; acceptable formats are: integer, Date, and POSIXct; if NULL, the time steps will be counted, with the first dates corresponding to 0.
cumulative	A logical indicating if data represent cumulative incidence; defaults to FALSE.
order_dates	A logical indicating whether the dates should be ordered, from the oldest to the most recent one; 'TRUE' by default.

Author(s)

Thibaut Jombart <thibautjombart@gmail.com>

See Also

the [project](#) function to generate the 'projections' objects.

cumulate.projections *Compute cumulative projections*

Description

cumulate is an S3 generic to compute cumulative numbers defined in the package incidence. The method for projections objects turns predicted incidences into cumulative incidences over time.

Usage

```
## S3 method for class 'projections'  
cumulate(x)
```

Arguments

x	A projections object.
---	-----------------------

Author(s)

Thibaut Jombart <thibautjombart@gmail.com>

See Also

The [project](#) function to generate the projections objects.

Examples

```
if (require(distcrete) &&
    require(incidence)) {

  ## simulate basic epicurve
  dat <- c(0, 2, 2, 3, 3, 5, 5, 5, 6, 6, 6, 6)
  i <- incidence(dat)

  ## example with a function for SI
  si <- distcrete("gamma", interval = 1L,
                 shape = 1.5,
                 scale = 2, w = 0)
  set.seed(1)
  pred_1 <- project(i, runif(100, 0.8, 1.9), si, n_days = 30)
  plot_1 <- plot(pred_1)

  ## cumulative predictions
  pred_1_cum <- cumulate(pred_1)
  pred_1_cum
  plot(pred_1_cum)
}
```

get_dates

Access content projections objects

Description

These simple helper functions retrieve content from projections objects. They currently include:

Usage

```
## S3 method for class 'projections'
get_dates(x, ...)
```

Arguments

x A projections object.
... Further arguments passed to methods; currently not used.

Details

- get_dates: get dates of the predictions.

Author(s)

Thibaut Jombart <thibautjombart@gmail.com>

Examples

```
if (require(distcrete) && require(incidence)) { withAutoprint({

## prepare input: epicurve and serial interval
dat <- c(0, 2, 2, 3, 3, 5, 5, 5, 6, 6, 6, 6)
i <- incidence(dat)
si <- distcrete("gamma", interval = 1L,
               shape = 1.5,
               scale = 2, w = 0)

## make predictions
pred_1 <- project(i, 1.2, si, n_days = 30)
pred_1

## retrieve content
get_dates(pred_1)
max(i$dates) # predictions start 1 day after last incidence

}}}
```

merge_add_projections *Add data of different projections objects*

Description

This function adds counts from several ‘projections’ objects, making sure that they all use the same dates, adding rows of ‘0’ where needed. Simulations (columns) are recycled when needed if some objects have less simulations than others. The same operation is implemented by the ‘+’ operator.

Usage

```
merge_add_projections(x)

## S3 method for class 'projections'
a + b
```

Arguments

x A 'list' of 'projections' objects to be added.
a A 'projections' object.
b A 'projections' object.

Author(s)

Thibaut Jombart

Examples

```
if (require(incidence)) {  
  
  ## make toy data and projections  
  set.seed(1)  
  i <- incidence::incidence(as.Date('2020-01-01') +  
                             sample(1:20, 50, replace = TRUE))  
  si <- c(0.2, 0.5, 0.2, 0.1)  
  
  x_1 <- project(x = i[1:10],  
                si = si,  
                R = 3.5,  
                n_sim = 200,  
                n_days = 5)  
  
  x_2 <- project(x = i[11:20],  
                si = si,  
                R = 1.8,  
                n_sim = 300,  
                n_days = 10  
                )  
  
  ## check simulations  
  x_1 # first type  
  x_2 # other simulations  
  y <- x_1 + x_2 # add simulations  
  plot(y)  
  
}
```

merge_projections *Merge a list of projections objects*

Description

This function merges 'projections' objects, binding them by columns, making sure that they all use the same dates, adding rows of '0' where needed.

Usage

```
merge_projections(x)
```

Arguments

x A 'list' of 'projections' objects to be merged.

Author(s)

Thibaut Jombart

Examples

```
## generate toy data
dates <- Sys.Date() + c(0, 0, 2, 5, 6, 6, 7)
i <- incidence::incidence(dates)
si <- c(0.2, 0.5, 0.2, 0.1)
R0 <- 3.5

## make several projections objects
x <- lapply(1:10,
            function(j)
              project(x = i,
                     si = si,
                     R = R0,
                     n_sim = 2 * j,
                     R_fix_within = TRUE,
                     n_days = j,
                     model = "poisson"
                   ))

## see all dimensions
lapply(x, dim)
merge_projections(x)
```

plot.projections

Plot projections objects

Description

The plot method of projections objects (output by the function [project](#)) shows quantiles of predicted incidence over time. The function `add_projections` can be used to add a similar plot to an existing incidence plot. This latter function is piping friendly (see examples).

Usage

```
## S3 method for class 'projections'
plot(x, ylab = NULL, title = NULL, ...)

add_projections(
  p,
  x,
  quantiles = c(0.01, 0.05, 0.1, 0.5),
  ribbon = TRUE,
  boxplots = FALSE,
  palette = quantile_pal,
  quantiles_alpha = 1,
  linetype = 1,
  linesize = 0.5,
  ribbon_quantiles = NULL,
  ribbon_color = NULL,
  ribbon_alpha = 0.3,
  boxplots_color = "#47476b",
  boxplots_fill = "grey",
  boxplots_alpha = 0.8,
  outliers = TRUE
)
```

Arguments

<code>x</code>	A projections object.
<code>ylab</code>	An optional label for the y-axis. If missing will default to "predicted incidence" or, if cumulative, "predicted cumulative incidence"
<code>title</code>	An optional title.
<code>...</code>	Further arguments to be passed to <code>add_projections</code> .
<code>p</code>	A previous incidence plot to which projections should be added.
<code>quantiles</code>	A vector of quantiles to plot, automatically completed to be symmetric around the median.
<code>ribbon</code>	A logical indicating if a ribbon should be drawn; defaults to TRUE.
<code>boxplots</code>	A logical indicating if boxplots should be drawn.
<code>palette</code>	A color palette to be used for plotting the quantile lines; defaults to <code>quantile_pal</code> .
<code>quantiles_alpha</code>	A number used to control the transparency of the quantile lines, from 0 (full transparency) to 1 (full opacity); defaults to 1.
<code>linetype</code>	An integer indicating the type of line used for plotting the quantiles; defaults to 1 for a plain line.
<code>linesize</code>	An integer indicating the size of line used for plotting the quantiles; defaults to 0.5.

ribbon_quantiles	A vector of 2 quantiles to be used to determine the limits of the ribbon; if NULL (default); uses the most extreme quantiles if available; if quantiles are not provided, the daily range will be used.
ribbon_color	Any valid color, used for the ribbon.
ribbon_alpha	A number used to control the transparency of the ribbon, from 0 (full transparency) to 1 (full opacity); defaults to 0.3.
boxplots_color	Any valid color, used for the boxplot.
boxplots_fill	Any valid color, used for filling the boxplot.
boxplots_alpha	A number used to control the transparency of the boxplots, from 0 (full transparency) to 1 (full opacity); defaults to 0.8.
outliers	A logical indicating if outliers should be displayed alongside the boxplots; defaults to TRUE.

Author(s)

Thibaut Jombart <thibautjombart@gmail.com>

See Also

[project](#) to generate projections

Examples

```

if (require(outbreaks) &&
    require(distcrete) &&
    require(incidence) &&
    require(magrittr)) {

  si <- distcrete("gamma",
                 interval = 1L,
                 shape = 2.4,
                 scale = 4.7,
                 w = 0.5)

  i <- incidence(ebola_sim$linelist$date_of_onset)
  plot(i)

  ## add projections after the first 100 days, over 60 days
  set.seed(1)
  proj <- project(x = i[1:100], R = 1.4, si = si, n_days = 60)

  ## plotting projections: different options
  plot(proj)
  plot(proj, quantiles = c(.025, .5)) # 95% CI
  plot(proj, ribbon_color = "red", quantiles = FALSE) # range
  plot(proj, ribbon_color = "red", quantiles = FALSE,
        ribbon_quantiles = c(.025, .5))
  plot(proj, boxplots = TRUE, quantiles = FALSE, ribbon = FALSE)

```

```
plot(proj, boxplots = TRUE, quantiles = FALSE, outliers = FALSE)
plot(proj, linetype = 3)

## adding them to incidence plot
plot(i) %>% add_projections(proj)
plot(i[1:160]) %>% add_projections(proj)
plot(i[1:160]) %>% add_projections(proj, boxplots = FALSE)
plot(i[1:160]) %>%
  add_projections(proj, boxplots_alpha = .3, boxplots_color = "red")

## same, with customised quantiles and colors
quantiles <- c(.001, .01, 0.05, .1, .2, .3, .4, .5)
pal <- colorRampPalette(c("#b3c6ff", "#00e64d", "#cc0066"))
plot(i[1:200]) %>%
  add_projections(proj, quantiles, palette = pal)

}
```

`print.projections` *Print method for projections objects*

Description

This method prints the content of projections objects.

Usage

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

Arguments

`x` A projections object.
`...` further parameters to be passed to other methods (currently not used)

Author(s)

Thibaut Jombart (<thibautjombart@gmail.com>)

project	<i>Project future incidence</i>
---------	---------------------------------

Description

This function simulates future incidence based on past incidence data, a selection of plausible reproduction numbers (R), and the distribution of the serial interval (time from primary onset to secondary onset).

Usage

```
project(
  x,
  R,
  si,
  n_sim = 100,
  n_days = 7,
  R_fix_within = FALSE,
  model = c("poisson", "negbin"),
  size = 0.03,
  time_change = NULL
)
```

Arguments

x	An incidence object containing daily incidence; other time intervals will trigger an error.
R	A vector of numbers representing plausible reproduction numbers; for instance, these can be samples from a posterior distribution using the ‘earlyR’ or ‘Epi-Estim’ packages. If ‘time_change’ is provided, then it must be a ‘vector’ (for fixed values of R per time window) or a ‘list’ of vectors (for separate distributions of R per time window), with one element more than the number of dates in ‘time_change’.
si	A function computing the serial interval, or a ‘numeric’ vector providing its mass function, starting a day 1, so that si[i] is the PMF for serial interval of ‘i’. The model implicitly assumes that ‘si[0] = 0’. For functions, we strongly recommend using the RECON package <code>distcrete</code> to obtain such distribution (see example).
n_sim	The number of epicurves to simulate. Defaults to 100.
n_days	The number of days to run simulations for. Defaults to 14.
R_fix_within	A logical indicating if R should be fixed within simulations (but still varying across simulations). If FALSE, R is drawn for every simulation and every time step. Fixing values within simulations favours more extreme predictions (see details)
model	Distribution to be used for projections. Must be one of "poisson" or "negbin" (negative binomial process). Defaults to poisson

`size` size parameter of negative binomial distribution. Ignored if model is poisson

`time_change` an optional vector of times at which the simulations should use a different sample of reproduction numbers, provided in days into the simulation (so that day '1' is the first day after the input 'incidence' object); if provided, 'n' dates in 'time_change' will produce 'n+1' time windows, in which case 'R' should be a list of vectors of 'n+1' 'R' values, one per each time window.

Details

The decision to fix R values within simulations (`R_fix_within`) reflects two alternative views of the uncertainty associated with R. When drawing R values at random from the provided sample, (`R_fix_within` set to FALSE), it is assumed that R varies naturally, and can be treated as a random variable with a given distribution. When fixing values within simulations (`R_fix_within` set to TRUE), R is treated as a fixed parameter, and the uncertainty is merely a consequence of the estimation of R. In other words, the first view is rather Bayesian, while the second is more frequentist.

Author(s)

Pierre Nouvellet (original model), Thibaut Jombart (bulk of the code), Sangeeta Bhatia (Negative Binomial model), Stephane Ghazzi (bug fixes time varying R)

Examples

```
## example using simulated Ebola outbreak
if (require(outbreaks) &&
    require(distcrete) &&
    require(incidence) &&
    require(magrittr)) {

  si <- distcrete("gamma", interval = 1L,
                 shape = 2.4,
                 scale = 4.7,
                 w = 0.5)

  i <- incidence(ebola_sim$linelist$date_of_onset)
  plot(i)

  ## projections after the first 100 days, over 60 days, fixed R to 2.1

  set.seed(1)
  proj_1 <- project(x = i[1:100], R = 2.1, si = si, n_days = 60)
  plot(proj_1)

  ## add projections to incidence plot
  plot(i[1:160]) %>% add_projections(proj_1)

  ## projections after the first 100 days, over 60 days,
  ## using a sample of R
```

```
set.seed(1)
R <- rnorm(100, 1.8, 0.2)
hist(R, col = "grey", border = "white", main = "Distribution of R")
proj_2 <- project(x = i[1:100], R = R, si = si, n_days = 60)

## add projections to incidence plot
plot(i[1:160]) %>% add_projections(proj_2)

## same with R constant per simulation (more variability)

set.seed(1)
proj_3 <- project(x = i[1:100], R = R, si = si, n_days = 60,
                 R_fix_within = TRUE)

## add projections to incidence plot
plot(i[1:160]) %>% add_projections(proj_3)

## time-varying R, 2 periods, R is 2.1 then 0.5
set.seed(1)
proj_4 <- project(i,
                 R = c(2.1, 0.5),
                 si = si,
                 n_days = 60,
                 time_change = 40,
                 n_sim = 100)

plot(proj_4)

## time-varying R, 2 periods, separate distributions of R for each period
set.seed(1)
R_period_1 <- runif(100, min = 1.1, max = 3)
R_period_2 <- runif(100, min = 0.6, max = .9)

proj_5 <- project(i,
                 R = list(R_period_1, R_period_2),
                 si = si,
                 n_days = 60,
                 time_change = 20,
                 n_sim = 100)

plot(proj_5)

}
```

Description

This method summarises predicted epidemic trajectories contained in a 'projections' object by days, deriving the mean, standard deviation, and user-specified quantiles for each day.

Usage

```
## S3 method for class 'projections'
summary(
  object,
  quantiles = c(0.025, 0.25, 0.5, 0.75, 0.975),
  mean = TRUE,
  sd = TRUE,
  min = TRUE,
  max = TRUE,
  ...
)
```

Arguments

object	A 'projections' object to summarise
quantiles	A 'numeric' vector indicating which quantiles should be computed; ignored if 'FALSE' or of length 0
mean	a 'logical' indicating of the mean should be computed
sd	a 'logical' indicating of the standard deviation should be computed
min	a 'logical' indicating of the minimum should be computed
max	a 'logical' indicating of the maximum should be computed
...	only present for compatibility with the generic

```
if (require(incidence)) i <- incidence::incidence(as.Date('2020-01-23')) si <-
c(0.2, 0.5, 0.2, 0.1) R0 <- 2
p <- project(x = i, si = si, R = R0, n_sim = 2, R_fix_within = TRUE, n_days =
10, model = "poisson" ) summary(p)
```

Author(s)

Thibaut Jombart

[.projections

Subsetting 'projections' objects

Description

Two functions can be used to subset projections objects. The operator "[" can be used as for matrices, using the syntax `x[i, j]` where 'i' is a subset of dates, and 'j' is a subset of simulations.

Usage

```
## S3 method for class 'projections'  
x[i, j]  
  
## S3 method for class 'projections'  
subset(x, ..., from = NULL, to = NULL, sim = TRUE)
```

Arguments

x	An projections object, generated by the function project .
i	a subset of dates to retain
j	a subset of groups to retain
...	Further arguments passed to other methods (not used).
from	The starting date; data strictly before this date are discarded.
to	The ending date; data strictly after this date are discarded.
sim	(optional) The simulations to retained, indicated as subsets of the columns of x.

Author(s)

Thibaut Jombart <thibautjombart@gmail.com>

See Also

The [project](#) function to generate the 'projections' objects.

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