

Package ‘NobBS’

July 21, 2025

Title Nowcasting by Bayesian Smoothing

Version 1.1.0

Description A Bayesian approach to estimate the number of occurred-but-not-yet-reported cases from incomplete, time-stamped reporting data for disease outbreaks. 'NobBS' learns the reporting delay distribution and the time evolution of the epidemic curve to produce smoothed nowcasts in both stable and time-varying case reporting settings, as described in McGough et al. (2020) <[doi:10.1371/journal.pcbi.1007735](https://doi.org/10.1371/journal.pcbi.1007735)>.

Depends R (>= 3.3.0)

SystemRequirements JAGS (<http://mcmc-jags.sourceforge.net/>) for analysis of Bayesian hierarchical models

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Encoding UTF-8

LazyData true

Imports dplyr, rlang, rjags, coda, magrittr

RoxygenNote 7.3.2

Suggests knitr, rmarkdown, scoringutils (>= 2.0.0), ggplot2

VignetteBuilder knitr

NeedsCompilation no

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Repository CRAN

Date/Publication 2025-05-07 12:30:25 UTC

Contents

denguedat	2
mpoxdat	2
NobBS	3
NobBS.strat	5

Index	8
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denguedat	<i>denguedat: Dengue fever reporting data from Puerto Rico</i>
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Description

Surveillance data from CDC Division of Vector-Borne Diseases. 1990-2010 case reporting data included. The first column, onset_week, indicates the week of symptom onset. The second column, report_week, indicates the week of case report. The third column, gender, indicates the gender of the infected individual (randomly assigned with 0.5:0.5 probability of "Male"/"Female"). This column may be used to produce stratified nowcasts using the function NobBS.strat.

Usage

```
data(denguedat)
```

Format

A data frame.

Examples

```
data(denguedat)
nowcast <- NobBS(denguedat, as.Date("1990-04-09"), units="1 week", onset_date="onset_week",
report_date="report_week")
nowcast$estimates
```

mpoxdat	<i>mpoxdat: Mpox reporting data from the 2022 New York City Outbreak</i>
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Description

Surveillance line list data provided by the New York City (NYC) Health Department at https://github.com/nychealth/mpox_no to accompany a nowcasting performance evaluation (doi: 10.2196/56495). Patients with a confirmed or probable mpox diagnosis or illness onset from July 8 through September 30, 2022 were included. The dataset contains 3323 rows and 4 columns. The first column, dx_date, is the specimen collection date of the first positive mpox laboratory result. The second column, dx_report_date, is the date the report of first positive mpox laboratory result was received by the NYC Health Department. The third column, onset_date, is the mpox symptom onset date. The fourth column, onset_report_date, is the date symptom onset date was received by the NYC Health Department.

Usage

```
data(mpxdat)
```

Format

A data frame.

Examples

```
data(mpxdat)
nowcast <- NobBS(mpxdat, as.Date("2022-08-31"), units="1 day", onset_date="dx_date",
report_date="dx_report_date", moving_window=14)
nowcast$estimates
```

NobBS	<i>Produce smooth Bayesian nowcasts of incomplete, time-stamped reporting data.</i>
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Description

Nowcasting is useful to estimate the true number of cases when they are unknown or incomplete in the present because of reporting delays. 'NobBS' is a Bayesian nowcasting approach that learns from the reporting delay distribution as well as the temporal evolution of the epidemic curve to estimate the number of occurred but not yet reported cases for a given date.

Usage

```
NobBS(
  data,
  now,
  units,
  onset_date,
  report_date,
  moving_window = NULL,
  max_D = NULL,
  cutoff_D = NULL,
  add_dow_cov = FALSE,
  proportion_reported = 1,
  quiet = TRUE,
  specs = list(dist = c("Poisson", "NB"), alpha1.mean.prior = 0, alpha1.prec.prior =
0.001, alphas.shape.prior = 0.001, alphas.rate.prior = 0.001, beta.priors = NULL,
gamma.mean.prior = rep(0, 6), gamma.prec.prior = rep(0.25, 6), param_names = NULL,
conf = 0.95, quantiles = c(0.025, 0.25, 0.5, 0.75, 0.975), dispersion.prior = NULL,
nAdapt = 1000, nChains = 1, nBurnin = 1000, nThin = 1, nSamp = 10000)
)
```

Arguments

<code>data</code>	A time series of reporting data in line list format (one row per case), with a column <code>onset_date</code> indicating date of case onset, and a column <code>report_date</code> indicating date of case report.
<code>now</code>	An object of datatype <code>Date</code> indicating the date at which to perform the nowcast.
<code>units</code>	Time scale of reporting. Options: "1 day", "1 week".
<code>onset_date</code>	In quotations, the name of the column of datatype <code>Date</code> designating the date of case onset. e.g. "onset_week"
<code>report_date</code>	In quotations, the name of the column of datatype <code>Date</code> designating the date of case report. e.g. "report_week"
<code>moving_window</code>	Size of moving window for estimation of cases (numeric). The moving window size should be specified in the same date units as the reporting data (i.e. specify 7 to indicate 7 days, 7 weeks, etc). Default: <code>NULL</code> , i.e. takes all historical dates into consideration.
<code>max_D</code>	Maximum possible delay observed or considered for estimation of the delay distribution (numeric). Default: (length of unique dates in time series)-1 ; or, if a moving window is specified, (size of moving window)-1
<code>cutoff_D</code>	Consider only delays $d \leq \text{max_D}$? Default: <code>TRUE</code> . If <code>cutoff_D=TRUE</code> , delays beyond <code>max_D</code> are ignored. If <code>cutoff_D=FALSE</code> , <code>max_D</code> is interpreted as delays $\geq \text{max_D}$ but within the moving window given by <code>moving_window</code> .
<code>add_dow_cov</code>	Whether or not to add day-of-week covariates to the model
<code>proportion_reported</code>	A decimal greater than 0 and less than or equal to 1 representing the proportion of all cases expected to be reported. Default: 1, e.g. 100 percent of all cases will eventually be reported. For asymptomatic diseases where not all cases will ever be reported, or for outbreaks in which severe under-reporting is expected, change this to less than 1.
<code>quiet</code>	Suppress all output and progress bars from the JAGS process. Default: <code>TRUE</code> .
<code>specs</code>	A list with arguments specifying the Bayesian model used: <code>dist</code> (Default: "Poisson"), <code>beta.priors</code> (Default: 0.1 for each delay d), <code>nSamp</code> (Default: 10000), <code>nBurnin</code> (Default: 1000), <code>nAdapt</code> (Default: 1000), <code>nChains</code> (Default: 1), <code>nThin</code> (Default: 1), <code>alphan.shape.prior</code> (Default: 0.001), <code>alphan.rate.prior</code> (Default: 0.001), <code>alpha1.mean.prior</code> (Default: 0), <code>alpha1.prec.prior</code> (Default: 0.001), <code>gamma.mean.prior</code> (Default: 0 for each day of the week (Monday-Saturday) - i.e. assuming initially no difference from Sunday), <code>gamma.prec.prior</code> (Default: 0.25 for each day of the week), <code>dispersion.prior</code> (Default: <code>NULL</code> , i.e. no dispersion. Otherwise, enter <code>c(shape,rate)</code> for a Gamma distribution.), <code>conf</code> (Default: 0.95), <code>quantiles</code> (Default: 5 quantiles for median, 50% PI and 95% PI), <code>param_names</code> (Default: <code>NULL</code> , i.e. output for all parameters is provided: <code>c("lambda","alpha","beta.logged","tau2.alpha")</code>). See McGough et al. 2019 (https://www.biorxiv.org/content/10.1101/663823v1) for detailed explanation of these parameters.).

Value

The function returns a list with the following elements: `estimates`, a 5-column data frame containing estimates for each date in the window of predictions (up to "now") with corresponding date of case onset, lower and upper bounds of the prediction interval, and the number of cases for that onset date reported up to 'now'. If `quantiles` is not NULL added columns will report the estimates for the requested quantiles; `estimates.inflated`, a Tx4 data frame containing estimates inflated by the `proportion_reported` for each date in the time series (up to "now") with corresponding date of case onset, lower and upper bounds of the prediction interval, and the number of cases for that onset date reported up to 'now'. If `quantiles` is not NULL added columns will report the inflated estimates for the requested quantiles; `nowcast.post.samples`, vector of 10,000 samples from the posterior predictive distribution of the nowcast, and `params.post`, a 10,000xN dataframe containing 10,000 posterior samples for the "N" parameters specified in `specs[["param_names"]]`. See McGough et al. 2019 (<https://www.biorxiv.org/content/10.1101/663823v1>) for detailed explanation of parameters.

Notes

'NobBS' requires that JAGS (Just Another Gibbs Sampler) is downloaded to the system. JAGS can be downloaded at <http://mcmc-jags.sourceforge.net/>.

Examples

```
# Load the data
data(denguedat)
# Perform default 'NobBS' assuming Poisson distribution, vague priors, and default specifications.
nowcast <- NobBS(denguedat, as.Date("1990-04-09"), units="1 week", onset_date="onset_week",
report_date="report_week")
nowcast$estimates
```

NobBS.strat

Stratified nowcasts of incomplete, time-stamped reporting data.

Description

Produces nowcasts stratified by a single variable of interest, e.g. by geographic unit (province/state/region) or by age group.

Usage

```
NobBS.strat(
  data,
  now,
  units,
  onset_date,
  report_date,
  strata,
  moving_window = NULL,
  max_D = NULL,
```

```

cutoff_D = NULL,
add_dow_cov = FALSE,
quiet = TRUE,
proportion_reported = 1,
specs = list(dist = c("Poisson", "NB"), alpha1.mean.prior = 0, alpha1.prec.prior =
  0.001, alphas.shape.prior = 0.001, alphas.rate.prior = 0.001, beta.priors = NULL,
  gamma.mean.prior = rep(0, 6), gamma.prec.prior = rep(0.25, 6), param_names = NULL,
  conf = 0.95, quantiles = c(0.025, 0.25, 0.5, 0.75, 0.975), dispersion.prior = NULL,
  nAdapt = 1000, nChains = 1, nBurnin = 1000, nThin = 1, nSamp = 10000)
)

```

Arguments

<code>data</code>	A time series of reporting data in line list format (one row per case), with a column <code>onset_date</code> indicating date of case onset, and a column <code>report_date</code> indicating date of case report.
<code>now</code>	An object of datatype <code>Date</code> indicating the date at which to perform the nowcast.
<code>units</code>	Time scale of reporting. Options: "1 day", "1 week".
<code>onset_date</code>	In quotations, the name of the column of datatype <code>Date</code> designating the date of case onset. e.g. "onset_week"
<code>report_date</code>	In quotations, the name of the column of datatype <code>Date</code> designating the date of case report. e.g. "report_week"
<code>strata</code>	In quotations, the name of the column indicating the stratifying variable.
<code>moving_window</code>	Size of moving window for estimation of cases (numeric). The moving window size should be specified in the same date units as the reporting data (i.e. specify 7 to indicate 7 days, 7 weeks, etc). Default: <code>NULL</code> , i.e. takes all historical dates into consideration.
<code>max_D</code>	Maximum possible delay observed or considered for estimation of the delay distribution (numeric). Default: (length of unique dates in time series)-1 ; or, if a moving window is specified, (size of moving window)-1
<code>cutoff_D</code>	Consider only delays $d \leq \text{max_D}$? Default: <code>TRUE</code> . If <code>cutoff_D=TRUE</code> , delays beyond <code>max_D</code> are ignored. If <code>cutoff_D=FALSE</code> , <code>max_D</code> is interpreted as delays $\geq \text{max_D}$ but within the moving window given by <code>moving_window</code> .
<code>add_dow_cov</code>	Whether or not to add day-of-week covariates to the model
<code>quiet</code>	Suppress all output and progress bars from the JAGS process. Default: <code>TRUE</code> .
<code>proportion_reported</code>	A decimal greater than 0 and less than or equal to 1 representing the proportion of all cases expected to be reported. Default: 1, e.g. 100 percent of all cases will eventually be reported. For asymptomatic diseases where not all cases will ever be reported, or for outbreaks in which severe under-reporting is expected, change this to less than 1.
<code>specs</code>	A list with arguments specifying the Bayesian model used: <code>dist</code> (Default: "Poisson"), <code>beta.priors</code> (Default: 0.1 for each delay d), <code>nSamp</code> (Default: 10000), <code>nBurnin</code> (Default: 1000), <code>nAdapt</code> (Default: 1000), <code>nChains</code> (Default: 1), <code>nThin</code> (Default: 1), <code>alphas.shape.prior</code> (Default: 0.001), <code>alphas.rate.prior</code> (Default: 0.001), <code>alpha1.mean.prior</code> (Default: 0), <code>alpha1.prec.prior</code> (Default:

0.001), `gamma.mean.prior` (Default: 0 for each day of the week (Monday-Saturday) - i.e. assuming initially no difference from Sunday), `gamma.prec.prior` (Default: 0.25 for each day of the week), `dispersion.prior` (Default: NULL, i.e. no dispersion. Otherwise, enter `c(shape,rate)` for a Gamma distribution.), `conf` (Default: 0.95), `quantiles` (Default: 5 quantiles for median, 50% PI and 95% PI), `param_names` (Default: NULL, i.e. output for all parameters is provided: `c("lambda","alpha","beta.logged","tau2.alpha")`). See McGough et al. 2019 (<https://www.biorxiv.org/content/10.1101/663823v1>) for detailed explanation of these parameters.).

Value

The function returns a list with the following elements: `estimates`, a 5-column data frame containing estimates for each date in the window of predictions (up to "now") with corresponding date of case onset, lower and upper bounds of the prediction interval, and the number of cases for that onset date reported up to 'now'. If `quantiles` is not NULL added columns will report the estimates for the requested quantiles; `estimates.inflated`, a Tx4 data frame containing estimates inflated by the `proportion_reported` for each date in the time series (up to "now") with corresponding date of case onset, lower and upper bounds of the prediction interval, and the number of cases for that onset date reported up to 'now'. If `quantiles` is not NULL added columns will report the inflated estimates for the requested quantiles; `nowcast.post.samples`, vector of 10,000 samples from the posterior predictive distribution of the nowcast, and `params.post`, a 10,000xN dataframe containing 10,000 posterior samples for the "N" parameters specified in `specs[["param_names"]]`. See McGough et al. 2019 (<https://www.biorxiv.org/content/10.1101/663823v1>) for detailed explanation of parameters.

Notes

'NobBS' requires that JAGS (Just Another Gibbs Sampler) is downloaded to the system. JAGS can be downloaded at <http://mcmc-jags.sourceforge.net/>.

Examples

```
# Load the data
data(denguedat)
# Perform stratified 'NobBS' assuming Poisson distribution, vague priors, and default
# specifications.
nowcast <- NobBS.strat(denguedat, as.Date("1990-02-05"),units="1 week",onset_date="onset_week",
report_date="report_week",strata="gender")
nowcast$estimates
```

Index

- * **dengue**
 - denguedat, [2](#)
- * **mpox**
 - mpoxdat, [2](#)
- denguedat, [2](#)
- mpoxdat, [2](#)
- NobBS, [3](#)
- NobBS.strat, [5](#)