# Package 'splinesurv'

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Title Nonparametric bayesian survival analysis
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<b>Depends</b> R (>= 2.5.0), MASS, survival
Suggests coda, tkrplot
<b>Description</b> Utilities for nonparametric Bayesian analysis of clustered survival data. The baseline hazard function and frailty density are modeled using penalized B-splines. Options include adaptive knot selection and the inclusion of a parametric component.
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# Description

plot.splinesurv

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Function to plot the the baseline hazard, frailty density, and posterior density of regression parameters for objects of type splinesurv, with optional pointwise credible bands.

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Plots for splinesury objects

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## Usage

```
## S3 method for class 'splinesurv':
plot(x, which = c("hazard", "survival", "frailty", "coef", "all"),
   newdata = NULL, iter=NULL, fn = mean, plotknots = TRUE, npoints = 100,
   npost = 100, alpha = .05, legend = NULL, lty = 1, col = 2, lwd = 2,
   lty.knots = 1, col.knots = 8, lwd.knots = 1, xlab = NULL, ylab = NULL,
   main = NULL, xlim = NULL, ylim = NULL, tk = FALSE, ...)
```

## **Arguments**

guments	
Х	an object of type splinesurv.
which	a string specifying which plot to produce. Setting "hazard" plots the base-line hazard (default), "survival" plots the survivor function, "frailty" plots the frailty density, "coef" plots the posterior density of the coefficients. Setting "all" plots all plots at once.
newdata	a data frame in the same format as the original data containing data for prediction of the hazard or survival function. If it has more than one row, multiple functions will be plotted, but credible bands will not.
iter	integer, indicating which iteration of the MCMC chain to plot. If ${\tt NULL}$ (default), the posterior means are used
plotknots	boolean indicating whether frailty spline knots should be plotted as vertical lines
fn	function to be applied to the posterior samples. Defaults to mean, but can be set to median or any other summary function.
npoints	number of points to be used for drawing
npost	number of samples from the posterior to be used for estimating the curve
alpha	level for plotting pointwise confidence bands. Setting ${\tt alpha=NULL}$ omits bands.
legend	legend text, if desired
lty	line type for primary curve
col	color for primary curve
lwd	line width for primary curve
lty.knots	line type for knots
col.knots	color of the knot lines
lwd.knots	line width of the knot lines
xlab	x-axis label
ylab	y-axis label
main	main plot title
xlim	x-axis limits
ylim	y-axis limits
tk	boolean indicator whether to use the tkrplot GUI
• • •	additional parameters passed on to plot

predict.splinesurv 3

```
predict.splinesurv Prediction for splinesurv objects
```

## Description

Function to predict the the baseline hazard, frailty density, linear predictor, or risk for objects of type splinesurv.

## Usage

## **Arguments**

object	an object of type splinesurv.
type	a string specifying the type of prediction. Setting "hazard" predicts the baseline hazard (default), survival predicts the survivor function, "lp" predicts the linear predictor, "risk" produces risk estimates, and "frailty" predicts the frailty density.
X	a vector containing the values at which prediction is desired. If NULL, a sequence of length 100 over the data range is used.
newdata	a data frame in the same format as the original data containing data for prediction. If cluster membership is not set to NA, the frailty is included in predictions of the hazard or survival.
iter	integer, indicating which iteration of the MCMC chain to use. If ${\tt NULL}$ (default), the posterior means are used
npost	number of samples from the posterior to be used for estimating the curve
fn	function to be applied to the posterior samples. Defaults to mean, but can be set to median or any other summary function.
alpha	level of pointwise confidence bands. Setting ${\tt alpha=NULL}$ omits bands.
• • •	additional parameters currently ignored

sim.sample Simulated survival data generator		
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# Description

Generates a simulated sample of clustered survival data, allowing for flexible baseline hazard and frailty distributions.

## Usage

```
sim.sample(m = 10, Ji = rep(5,10), params=NULL)
```

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#### **Arguments**

an integer, number of clusters in the sample. m

Ji a vector of length m containing the number of subjects in each cluster.

params a list, optionally containing the parameters that specify the covariate distribution,

baseline hazard, frailty distribution, and censoring time, as follows:

beta the "true" value of the single covariate.

**haz.type** a string specifying the type of hazard to be used.

**haz.params** a list with parameters corresponding to the hazard type.

**frail.type** a string specifying the type of frailty to be used.

**frail.params** a list with parameters corresponding to the frailty type.

**Z.type** a string specifying the type of covariate to be used.

**Z.params** a list with parameters corresponding to the covariate type.

**C.type** a string specifying the type of censoring to be used.

**C.params** a list with parameters corresponding to the censoring type.

The default corresponds to standard normal covariates, a Weibull hazard, gamma frailties and a Weibull censoring time. See details.

#### **Details**

The possible values for frail.type, Z.type, C.type and the corresponding entries in frail.params, Z.params and C.params are as follows:

- \*.type="fixed" \*.params is a list with component value, containing the fixed value.
- \*.type="weibull" \*.params is a list with components \lambda0 and gamweib, for components  $\lambda$  and  $\gamma$  of the Weibull distribution.
- \*.type="gamma", \*.type="normal", \*.type="lognormal" \*.params is a list with components mu and sigma2, giving the mean and variance of the gamma, normal or lognormal distribution desired.
- \*.type="normmix", \*.type="lognormmix" \*.params is a list of with components mu, sigma2 and w, all vectors of the same length, giving the mean, variance and weight of each component of the normal or lognormal mixture.

For haz.type, the possible values and parameters are:

- haz.type="weibull" haz.params is a list with components \lambda0 and gamweib, for components  $\lambda$  and  $\gamma$  of the Weibull distribution.
- haz.type="stepfunction" haz.params is a list with vectors breaks giving the positions of jumps in the stepfunction, and haz giving the initial value of the hazard and its value after each jump.
- haz.type="bspline" haz.params is a list with components b, a basis matrix generated by bs specifying the B-spline basis, and w, a vector of weights for each basis element.

## Value

A list with three components:

agdata a data.frame in with columns

i cluster id

**j** patient id within the cluster

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time time of eventdelta censoring indicatorZ value of the covariate

Ui a vector of frailties used in the simulation

params the set of parameters in the format of the input params. See details.

#### See Also

```
splinesurv
```

#### **Examples**

```
# Generate a simulated sample with default parameters
# (Weibull baseline and gamma frailty)
s <- sim.sample(m = 10, Ji = rep(10,10))
plot(survfit(coxph(Surv(time,delta) ~ Z + frailty(i), data = s$agdata)))
# Generate a sample with piecewise baseline hazard and
# lognormal mixture frailties
s2 <- sim.sample(m = 10, Ji = rep(10,10), params = list(
    haz.type = "stepfunction", haz.params = list(breaks = c(.25, .5),
    haz = c(1, 0 , 2)), frail.type = "lognormmix",
    frail.params = list(mu = c(.5, 2), sigma2 = c(.2, .2),
    w = c(.666, .333))))
plot(survfit(coxph(Surv(time,delta) ~ Z + frailty(i), data = s2$agdata)))</pre>
```

splinesurv-package Nonparametric bayesian survival analysis

# Description

Utilities for nonparametric Bayesian analysis of clustered survival data. The baseline hazard function and frailty density are modeled using penalized B-splines, and may optionally have a parametric component.

#### Details

The core function is splinesury, and methods for printing and plotting are provided as well. See the splinesury documentation for details on model specification and fitting procedure.

Package: splinesurv Version: 0.3-4

Depends: R (>= 2.5.0), MASS, survival

Suggests: coda License: GPL (>= 2)

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plot.splinesurv

Bayesian survival analysis with B-spline
baseline hazard and random effects density
plot.splinesurv

Summary method for splinesurv objects
```

## Author(s)

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splinesurv	Bayesian survival analysis with B-spline baseline hazard and random effects density
splinesurv	•

#### **Description**

Allows the fitting of proportional hazards survival models to possibly clustered data using Bayesian methods. The function follows a MCMC method to sample from the posterior distribution of the regression parameters, frailties, and parameters specifying the hazard and frailty distribution.

The baseline hazard and random effects density are modeled as convex combinations of a parametric component (for example, a gamma frailty, or a weibull baseline hazard) and a nonparametric component modeled as a penalized B-splines, with the penalty depending on either the integrated squared second derivative of the curve, or the sum of squared second differences in the spline parameters.

## Usage

## **Arguments**

formula	a formula object, similar to coxph. The response to the left of the $\sim$ should be a survival object generated by Surv. The right side may contain a cluster (x) term if x is the variable that indicates cluster membership.
data	a data.frame with columns corresponding to the terms in the formula.
verbose	an integer from 0 to 5 that determines the quantity of output printed to the screen. Setting verbose=0 is completely silent.
hazard	a list containing parameters defining the baseline hazard, with the following optional components. For any component that is not set, the default is used.
	<pre>type a string that determines whether the hazard is parametric, nonparametric,     or has both components. Takes on values "spline", "parametric"     or "both", with "spline" as default.</pre>
	<b>spline.adaptive</b> logical, determines whether adaptive knot selection should be used. Defaults to TRUE.

B-splines.

**spline.ord** an integer greater than 1, giving the order of the spline defining the baseline hazard. Defaults to spline.ord=4, corresponding to cubic

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**spline.nknots** an integer giving the number of interior knots used in the baseline hazard spline. If NULL, the number of knots is chosen automatically, which is the default. If spline.adaptive=TRUE, this only serves as the initial number of knots.

- **spline.nknots.hyper** the parameter(s) for the prior on the number of knots. For the Poisson prior, the mean, for the Geometric, the probability, for the Poisson-mixture, two means, and for the Power prior, the exponent.
- spline.knotspacing string that determines the way that knots are automatically chosen, if applicable. Possible values are "quantile" to
  place knots at quantiles of observed event times, or "equal" to equally
  space knots over the range of observed times. Defaults to "equal". If
  spline.adaptive=TRUE, this affects selection of candidate knot positions
- **spline.knots** a vector of length spline.nknots+2\*spline.ord-2 giving the positions of all the knots used in the baseline hazard spline (including boundary knots). If NULL, knots are chosen automatically. Defaults to NULL.
- spline.penalty a string giving the type of penalty to be used for the baseline hazard splines. Possible values are "none" for a standard Gaussian prior (default), "2diff", for a penalty on the second differences, or "2deriv" for a penalty on the integrated squared second derivative.
- **spline.hyper** a vector of length 2, containing hyperparameters for the spline weights. These control the smoothness of the spline when spline.adaptive=FALSE. Defaults to c (0.01,0.01).
- param.dist a string giving the desired parametric form of the hazard. Currently supported are "exponential" and "weibull".
- ... other parameters can be set as well, including tuning parameters, prior variances, hyperparameters, initial values for weights, etc, but this should not be attempted by someone unfamiliar with the source code.

a list containing parameters defining the frailty density, analogous to hazard, except for the following differences:

param.dist a string giving the desired parametric form of the frailty. Currently supported are "gamma" and "lognormal".

a list containing control parameters for the MCMC and optimization, with the following optional components. For any component that is not set, the default is used.

**burnin** an integer giving the number of iterations discarded as burn-in. Default is burnin=500.

- maxiter an integer giving the total number of MCMC iterations, must be greater than burnin. Default is maxiter=1000.
- thin an integer giving the number of iterations to be discarded between every recorded iteration. That is, if iter=10, a total of maxiter\*thin iterations will be run, but only maxiter will be recorded.
- tun.auto logical, determines whether to adaptively calibrate the tuning parameters during the burn-in period to achieve an acceptance rate of 0.25. Defaults to TRUE.

frailty

control

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> tun.int an integer giving the interval in iterations between calibration of the tuning parameters, if tun.auto=TRUE. Default is 100.

a list containing initial values for the chain. Not implemented and currently initial

ignored.

coda a logical variable indicating whether the coda package should be used to return

the parameter history as mcmc objects. Defaults to FALSE.

a logical variable, determines whether fast C code should be used. Defaults to usec

TRUE, and should only be set to FALSE for debugging.

additional parameters (currently ignored).

#### Value

An object of class splinesury, with the following components

call the original call to the model-fitting function

posterior.mean

a list containing the posterior means of all parameters, with the following components

coefficients regression coefficients

**frailty** frailty estimates

hazard.spline.par parameters defining the spline component (if appli-

hazard.param.par parameters defining the parametric component (if applicable)

hazard.weight weight of the spline component (if applicable)

frailty.spline.par parameters defining the spline component (if applicable)

frailty.param.par parameters defining the parametric component (if ap-

frailty.weight weight of the spline component (if applicable)

a list containing the parameter history of the MCMC iterations, with the following components, either as matrices or vectors of length maxiter:

**frailty** matrix of frailty estimates at each iteration.

**coefficients** matrix of regression parameter estimates at each iteration.

hazard.spline.par matrix of parameters defining the baseline hazard spline.

hazard.spline.knots matrix of knots defining the baseline hazard spline.

**frailty.spline.par** matrix of parameters defining the frailty density spline.

**frailty.spline.knots** matrix of knots defining the frailty density spline.

frailty.spline.fvar vector of estimated variances of the frailty density spline.

**priorvar** matrix of prior variance parameters for the regression parameters, hazard spline, frailty density spline, hazard parameters, frailty parameters, hazard weight, frailty weight, in that order.

accept binary vectors of Metropolis-Hastings acceptance indicators for the regression parameters, hazard spline, frailty density spline, hazard parameters, frailty parameters, hazard weight, frailty weight, and frailties respectively.

If in the input, coda=TRUE, then the returned objects are of class mcmc instead of matrix.

history

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frailty	a list analogous to $frailty$ in the input, additionally containing the number and placement of knots, if not specified in the input
hazard	a list analogous to $\verb hazard $ in the input, additionally containing the number and placement of knots, if not specified in the input
control	a list analogous to control in the input, containing the control parameters used in the procedure, even those not set explicitly in the call.

#### References

E. Sharef, D. Ruppert and R. Strawderman. "A Bayesian approach to clustered survival analysis with nonparametric baseline hazard and frailty distributions", *in preparation*.

#### See Also

```
summary.splinesurv, plot.splinesurv, coxph
```

## **Examples**

```
## Generate a small survival data set:
s <- sim.sample(m = 10, Ji = rep(10, 10))
agdata <- s$agdata

## Run a (very) short MCMC chain
fit <- splinesurv(Surv(time, delta) ~ Z + cluster(i), data = agdata, control = list(n)

## Run another chain, with a Weibull hazard and linear B-spline frailties

# with fixed knots.
fit2 <- splinesurv(Surv(time, delta) ~ Z + cluster(i), data = agdata, control = list(n)

## View summaries and plots of the fits
summary(fit)
plot(fit, "all")
summary(fit2)
plot(fit2, "all")</pre>
```

summary.splinesurv Summary method for splinesurv objects

#### **Description**

Prints a summary of a fit from splinesurv, including posterior means and quantiles of the posterior distribution for the regression parameters.

## Usage

```
## S3 method for class 'splinesurv':
summary(object, quantiles=c(.025,.975),...)
```

# Arguments

```
object an object of type splinesurv.

quantiles a vector of quantiles at which the posterior distribution should be printed. By default prints the boundary points of a two-sided 95% credible interval.

... additional parameters for print.
```

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## Value

An item of type summary.splinesurv with components call, coef, iter, burnin, hazard, frailty, posterior.mean as documented in splinesurv, as well as:

quantiles matrix with the posterior mean and desired quantiles of the regression parameters.

quantiles.fvar
 quantiles of the variance of the frailty density

quantiles.fvar2
 quantiles of the variance of the estimated frailties

# See Also

splinesurv

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