

# Package ‘spsurv’

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**Type** Package

**Title** Bernstein Polynomial Based Semiparametric Survival Analysis

**Version** 1.0.0

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## Description

A set of reliable routines to ease semiparametric survival regression modeling based on Bernstein polynomials. 'spsurv' includes proportional hazards, proportional odds and accelerated failure time frameworks for right-censored data. RV Panaro (2020) <[arXiv:2003.10548](#)>.

**License** GPL-3

**Biarch** true

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spsurv-package

*The 'spsurv' package.*


---

**Description**

A set of flexible routines to allow semiparametric survival regression modeling based on Bernstein polynomial, including Bernstein based proportional hazards model (BPPH), Bernstein polynomial based proportional odds model (BPPO) and Bernstein based accelerated failure time model (BPAFT) for right-censored data.

**Details**

`sppb` fits semi-parametric models for time-to-event survival data. Non-informative right-censoring assumption is available. Any user-defined Bernstein polynomial can be user-defined using an arbitrary degree, i.e. highest basis polynomials order.

The framework takes advantage of fully likelihood methods since the polynomial parameters are used to estimate the baseline functions. Even so, this is said to be semi-parametric since this approach does not rely on any distribution. Unlike the Cox model, the BP based models provide smooth hazard and survival curve estimates.

**Value**

none

**Author(s)**

Renato Valladares Panaro (renatovp@ime.usp.br).

**References**

Panaro R.V. (2020). `spsurv`: An R package for semi-parametric survival analysis. arXiv preprint arXiv:2003.10548.

Demarqui, F. N., & Mayrink, V. D. (2019). A fully likelihood-based approach to model survival data with crossing survival curves. arXiv preprint arXiv:1910.02406.

Demarqui, F. N., Mayrink, V. D., & Ghosh, S. K. (2019). An Unified Semiparametric Approach to Model Lifetime Data with Crossing Survival Curves. arXiv preprint arXiv:1910.04475.

Osman, M., & Ghosh, S. K. (2012). Nonparametric regression models for right-censored data using Bernstein polynomials. *Computational Statistics & Data Analysis*, 56(3), 559-573.

Lorentz, G. G. (1953). *Bernstein polynomials*. American Mathematical Society.

---

bp.basis

*Bernstein basis polynomials calculations*

---

**Description**

Bernstein basis polynomials calculations

**Usage**

```
bp.basis(time, degree, tau = max(time))
```

**Arguments**

time	a vector of times.
degree	Bernstein polynomial degree
tau	must be greater than times maximum value observed.

**Value**

A list containing matrices `b` and `B` corresponding BP basis and corresponding tau value used to compute them.

---

bpaft

*Bernstein Polynomial Based Accelerated Failure Time Model*

---

**Description**

Fits the BPAFT model to time-to-event data.

**Usage**

```
bpaft(formula, degree, data, approach = c("mle", "bayes"), ...)
```

**Arguments**

formula	a Surv object with time to event observations, right censoring status and explanatory terms.
degree	Bernstein polynomial degree.
data	a data.frame object.
approach	Bayesian or maximum likelihood estimation methods, default is approach = "mle".
...	further arguments passed to or from other methods

**Value**

An object of class 'spbp'.

**See Also**

[spbp](#), [bpbh](#) and [bppo](#) for other BP based models.

**Examples**

```
library("spsurv")
data("veteran")

fit <- bpaft(Surv(time, status) ~ karno + celltype,
             data = veteran)

summary(fit)
```

---

**bpph***Bernstein Polynomial Based Proportional Hazards Model*

---

**Description**

Fits the BPPH model to time-to-event data.

**Usage**

```
bpph(formula, degree, data, approach = c("mle", "bayes"), ...)
```

**Arguments**

formula	a Surv object with time to event observations, right censoring status and explanatory terms.
degree	Bernstein polynomial degree.
data	a data.frame object.
approach	Bayesian or maximum likelihood estimation methods, default is approach = "mle".
...	further arguments passed to or from other methods

**Value**

An object of class 'spbp'.

**See Also**

[spbp](#), [bppo](#) and [bpaft](#) for other BP based models.

**Examples**

```
library("spsurv")
data("veteran")

fit <- bpph(Surv(time, status) ~ karno + factor(celltype),
data = veteran)

summary(fit)
```

---

**bppo***Bernstein Polynomial Based Proportional Odds Model*

---

**Description**

Fits the BPPO model to time-to-event data.

**Usage**

```
bppo(formula, degree, data, approach = c("mle", "bayes"), ...)
```

**Arguments**

formula	a Surv object with time-to-event observations, right censoring status and explanatory terms.
degree	Bernstein polynomial degree.
data	a data.frame object.
approach	Bayesian or maximum likelihood estimation methods, default is approach = "mle".
...	further arguments passed to or from other methods

**Value**

An object of class 'spbp'.

**See Also**

[spbp](#), [bpqh](#) and [bpaft](#) for other BP based models.

**Examples**

```
library("spsurv")
data("veteran")

fit <- bppo(Surv(time, status) ~ karno + celltype,
data = veteran)

summary(fit)
```

---

coef	<i>Generic S3 method coef</i>
------	-------------------------------

---

**Description**

Generic S3 method coef

**Usage**

```
coef(spbp, ...)
```

**Arguments**

spbp	a fitted model object
...	further arguments passed to or from other methods.

**Value**

the estimated regression coefficients

---

coef.spbp	<i>Estimated regression coefficients</i>
-----------	--

---

**Description**

Estimated regression coefficients

**Usage**

```
## S3 method for class 'spbp'  
coef(spbp, ...)
```

**Arguments**

spbp	an object of the class spbp
...	further arguments passed to or from other methods

**Value**

the estimated regression coefficients

---

confint	<i>Generic S3 method confint</i>
---------	----------------------------------

---

**Description**

Generic S3 method confint

**Usage**

```
confint(spbp, ...)
```

**Arguments**

spbp	a fitted model object
...	further arguments passed to or from other methods.

**Value**

the estimated regression coefficients

---

confint.spbp	<i>Confidence intervals for the regression coefficients</i>
--------------	---

---

**Description**

Confidence intervals for the regression coefficients

**Usage**

```
## S3 method for class 'spbp'  
confint(spbp, level = 0.95, ...)
```

**Arguments**

spbp	an object of the class spbp
level	the confidence level required
...	further arguments passed to or from other methods

**Value**

100(1-alpha) confidence intervals for the regression coefficients



---

extract	<i>Generic S3 method extract</i>
---------	----------------------------------

---

**Description**

Generic S3 method extract

**Usage**

```
extract(spbp, ...)
```

**Arguments**

spbp	a fitted model object
...	further arguments passed to or from other methods.

**Value**

extract the MCMC chain values of a Bayesian fit.

---

extract.spbp	<i>Extract method for fitted spbp models</i>
--------------	--

---

**Description**

Extract samples from a fitted [spbp](#) model.

**Usage**

```
## S3 method for class 'spbp'
extract(spbp, pars = c("beta", "gamma"), ...)
```

**Arguments**

spbp	an object of class 'spbp' result of a <a href="#">spbp</a> fit.
pars	parameters to be selected.
...	arguments inherent from <a href="#">extract</a> .

**Value**

see [extract](#).

**See Also**

[spbp](#), [stan\\_dens.spbp](#), [traceplot.spbp](#)

**Examples**

```
library("spsurv")
data("veteran")

fit <- bpph(Surv(time, status) ~ karno + factor(celltype),
data = veteran)

extract(fit)
```

---

itsamp

---

*Inverse Transform Sampling To Generate Time-to-event Data From Parametric Models*


---

**Description**

Random survival times generation for the weibull or log-logistic distributions with parameters ‘scale’ and ‘shape’.

**Usage**

```
itsamp(
  n,
  beta = c(2, -1),
  event_scale = 10,
  censor_scale = 4,
  features = data.frame(x1 = rnorm(n, 0), x2 = rnorm(n, 0)),
  shape = 2,
  model = c("ph", "po", "aft"),
  dist = c("weibull", "llogis"),
  censor = TRUE
)
```

**Arguments**

n	integer; sample size
beta	vector of regression coefficients
event_scale, censor_scale	event and censoring scale parameters
features	matrix of features (columns)
shape	event and censoring distribution shape
model	either "ph" (default) or "aft" for weibull and "po" or "aft" for log-logistic distribution
dist	"weibull" or "llogis"
censor	logical; if ‘TRUE’, censoring is required, that is mean(status) > 0

**Details**

`sim_surv` returns weibull (log-logistic) randomly generated survival times. According to Collett (2003), the accelerated failure time model encompasses a wide variety of parametric models, including weibull and log-logistic models.

**Value**

data.frame of 'ncol(x) + 2' columns in which the survival times are the response variable denoted by 'y', 'status' indicates failure (0 = failure) and the features are appended to the next columns.

**See Also**

[spbp](#)

**Examples**

```
rows <- 200

categorical <- rbinom(rows, size = 3, prob = .5)
x <- data.frame(numerical = rnorm(rows),
               cat0 = as.numeric(categorical == 0),
               cat1 = as.numeric(categorical == 1),
               cat2 = as.numeric(categorical == 2),
               cat3 = as.numeric(categorical == 3))

newdata <- itsamp(n = rows, beta = c(1, -2, .5, .1, 1),
                 features = x, model = 'ph', dist = 'weibull')
```

---

mode

*Calculate the posterior mode*

---

**Description**

Calculate the posterior mode

**Usage**

```
mode(ext)
```

**Arguments**

`ext` `rstan` extracted sample.

**Value**

A vector containing the posterior mode of each sample.

---

model.matrix.spbp      *Model.matrix method for fitted spbp models*

---

### Description

Model.matrix of a fitted [spbp](#) model.

### Usage

```
## S3 method for class 'spbp'  
model.matrix(  
  object,  
  data = eval(object$call$data, envir = parent.frame()),  
  ...  
)
```

### Arguments

object            an object of class 'spbp', see [spbp](#).  
data              data.frame object.  
...               arguments inherent from [model.matrix](#).

### Value

The explanatory variables matrix.

### See Also

[spbp](#), [model.matrix](#)

### Examples

```
library("spsurv")  
data("veteran")  
  
fit <- bpph(Surv(time, status) ~ karno + factor(celltype),  
  data = veteran)  
  
model.matrix(fit)
```

---

```
print.spbp          Bernstein Polynomial Based Regression Object Print
```

---

**Description**

Bernstein Polynomial Based Regression Object Print

**Usage**

```
## S3 method for class 'spbp'
print(
  x,
  digits = max(getOption("digits") - 4, 3),
  signif.stars = getOption("show.signif.stars"),
  ...
)
```

**Arguments**

x	an object of class spbp
digits	number of digits to display
signif.stars	see <a href="#">getOption</a>
...	further arguments passed to or from other methods

**Value**

none

---

```
print.summary.bpaft.bayes
          Bernstein Polynomial Based Regression Object Summary BPAFT Bayes
```

---

**Description**

Bernstein Polynomial Based Regression Object Summary BPAFT Bayes

**Usage**

```
## S3 method for class 'summary.bpaft.bayes'
print(...)
```

**Arguments**

...	further arguments passed to or from other methods
-----	---

**Value**

none

---

`print.summary.bpaft.mle`*Bernstein Polynomial Based Regression Object Summary BPAFT MLE*

---

**Description**

Bernstein Polynomial Based Regression Object Summary BPAFT MLE

**Usage**

```
## S3 method for class 'summary.bpaft.mle'  
print(...)
```

**Arguments**

```
...          further arguments passed to or from other methods
```

**Value**

none

---

`print.summary.bpph.bayes`*Bernstein Polynomial Based Regression Object Summary BPPH Bayes*

---

**Description**

Bernstein Polynomial Based Regression Object Summary BPPH Bayes

**Usage**

```
## S3 method for class 'summary.bpph.bayes'  
print(...)
```

**Arguments**

```
...          further arguments passed to or from other methods
```

**Value**

none

---

print.summary.bpph.mle

*Bernstein Polynomial Based Regression Object Summary BPPH MLE*

---

**Description**

Bernstein Polynomial Based Regression Object Summary BPPH MLE

**Usage**

```
## S3 method for class 'summary.bpph.mle'  
print(...)
```

**Arguments**

... further arguments passed to or from other methods

**Value**

none

---

print.summary.bppo.bayes

*Bernstein Polynomial Based Regression Object Summary BPPO Bayes*

---

**Description**

Bernstein Polynomial Based Regression Object Summary BPPO Bayes

**Usage**

```
## S3 method for class 'summary.bppo.bayes'  
print(...)
```

**Arguments**

... further arguments passed to or from other methods

**Value**

none

---

```
print.summary.bppo.mle
```

*Bernstein Polynomial Based Regression Object BPPO MLE*

---

### Description

Bernstein Polynomial Based Regression Object BPPO MLE

### Usage

```
## S3 method for class 'summary.bppo.mle'
print(...)
```

### Arguments

... further arguments passed to or from other methods

### Value

none

---

```
print.summary.spbp.bayes
```

*Bernstein Polynomial Based Regression Object Summary Bayes*

---

### Description

Bernstein Polynomial Based Regression Object Summary Bayes

### Usage

```
## S3 method for class 'summary.spbp.bayes'
print(x, digits = max(getOption("digits") - 4, 3), ...)
```

### Arguments

x a summary.spbp.bayes object  
 digits number of digits to display.  
 ... further arguments passed to or from other methods

### Value

none



---

```
print.summary.spbp.mle
```

*Bernstein Polynomial Based Regression Object Summary MLE*

---

**Description**

Bernstein Polynomial Based Regression Object Summary MLE

**Usage**

```
## S3 method for class 'summary.spbp.mle'
print(
  x,
  digits = max(getOption("digits") - 4, 3),
  signif.stars = getOption("show.signif.stars"),
  ...
)
```

**Arguments**

x	a summary.spbp.mle object
digits	number of digits to display.
signif.stars	see <a href="#">getOption</a>
...	further arguments passed to or from other methods

**Value**

none

---

residuals.spbp	<i>BP based models residuals.</i>
----------------	-----------------------------------

---

**Description**

Residuals for a fitted [spbp](#) model.

**Usage**

```
## S3 method for class 'spbp'
residuals(object, type = c("cox-snell"), ...)
```

**Arguments**

object	an object of class 'spbp' result of a <a href="#">spbp</a> fit.
type	type of residuals, default is "cox-snell"
...	further arguments passed to or from other methods

**See Also**

[spbp](#).

**Examples**

```
library("spsurv")
data("veteran")

fit <- bpph(Surv(time, status) ~ karno + factor(celltype),
  data = veteran)

residuals(fit)
```

---

spbp

*spbp: The BP Based Survival Analysis Function*

---

**Description**

Semiparametric Survival Analysis Using Bernstein Polynomial

**Usage**

```
spbp(formula, ...)
```

**Arguments**

formula            a Surv object with time to event, status and explanatory terms.  
...                Arguments passed to 'rstan::sampling' (e.g. iter, chains) or 'rstan::optimizing'.

**Details**

Fits Bernstein Polynomial based Proportional regression to survival data.

**Value**

An object of class 'spbp'.

**See Also**

[spbp.default](#)

[spbp.default](#), [bpph](#), [bppp](#), [bpaft](#), <https://mc-stan.org/users/documentation/>

**Examples**

```

library("spsurv")
data("veteran") ## imports from survival package

fit_mle <- spbp(Surv(time, status) ~ karno + factor(celltype),
  data = veteran, model = "po")
summary(fit_mle)

fit_bayes <- spbp(Surv(time, status) ~ karno + factor(celltype),
  data = veteran, model = "po", approach = "bayes",
  cores = 1, iter = 300, chains = 1,
  priors = list(beta = c("normal(0,4)"),
  gamma = "lognormal(0,4)"))

summary(fit_bayes)

```

---

spbp.default

*spbp: The BP Based Semiparametric Survival Analysis Function*


---

**Description**

spbp: The BP Based Semiparametric Survival Analysis Function

**Usage**

```

## Default S3 method:
spbp(
  formula,
  degree,
  data,
  approach = c("mle", "bayes"),
  model = c("ph", "po", "aft"),
  priors = list(beta = c("normal(0,4)"), gamma = "lognormal(0,10)"),
  scale = TRUE,
  cores = parallel::detectCores(),
  ...
)

```

**Arguments**

formula	a Surv object with time to event, status and explanatory terms
degree	Bernstein Polynomial degree
data	a data.frame object
approach	Bayesian or Maximum Likelihood estimation methods, default is approach = "bayes"

model	Proportional Hazards or Proportional Odds BP based regression, default is model = "ph"
priors	prior settings for the Bayesian approach; 'normal' or 'cauchy' for beta; 'gamma', 'inv_gamma' or 'lognormal' for gamma (BP coefficients)
scale	logical; indicates whether to center and scale the data
cores	number of core threads to use
...	further arguments passed to or from other methods

**Value**

An object of class spbp

---

stan_dens	<i>Generic S3 method extract</i>
-----------	----------------------------------

---

**Description**

Generic S3 method extract

**Usage**

```
stan_dens(spbp, ...)
```

**Arguments**

spbp	a fitted model object
...	further arguments passed to or from other methods.

**Value**

the density plot of a MCMC chain.

---

stan_dens.spbp	<i>Density plots method for fitted spbp models</i>
----------------	--

---

**Description**

Posterior density of samples from a fitted [spbp](#) model.

**Usage**

```
## S3 method for class 'spbp'
stan_dens(spbp, pars = c("beta", "gamma"), ...)
```

**Arguments**

spbp            the result of a [spbp](#) fit.  
 pars            parameters to be selected.  
 ...             arguments inherent from [stan\\_dens](#).

**Value**

see [stan\\_dens](#).

**See Also**

[spbp](#), [traceplot.spbp](#), [extract.spbp](#)

**Examples**

```

library("spsurv")
data("veteran")

fit <- bpph(Surv(time, status) ~ karno + factor(celltype),
  data = veteran)

stan_dens(fit)

```

---

summary.spbp

*Bernstein Polynomial Based Regression Object Summary*


---

**Description**

Bernstein Polynomial Based Regression Object Summary

**Usage**

```

## S3 method for class 'spbp'
summary(object, interval = 0.95, ...)

```

**Arguments**

object            an object of class `spbp`  
 interval          interval coverage (confidence or credibility)  
 ...               further arguments passed to or from other methods

**Value**

An object of class analogous to for e.g. `'summary.bppo.bayes'`.

---

survivor	<i>Generic S3 method vcov</i>
----------	-------------------------------

---

**Description**

Generic S3 method vcov

**Usage**

```
survivor(spbp, ...)
```

**Arguments**

spbp	an object of class spbp
...	further arguments passed to or from other methods

**Value**

estimates survival for each dataset individual (line). Spbp Object Observed Survival

**See Also**

[spbp](#), [itsamp](#)

---

traceplot	<i>Generic S3 method traceplot</i>
-----------	------------------------------------

---

**Description**

Generic S3 method traceplot

**Usage**

```
traceplot(spbp, ...)
```

**Arguments**

spbp	a fitted model object
...	further arguments passed to or from other methods.

**Value**

the traceplot of a MCMC chain.

---

traceplot.spbp	<i>Traceplot method for fitted spbp models</i>
----------------	--

---

## Description

Traceplot of a Bayesian fit [spbp](#).

## Usage

```
## S3 method for class 'spbp'  
traceplot(spbp, pars = c("beta", "gamma"), ...)
```

## Arguments

spbp	an object of class 'spbp' result of a <a href="#">spbp</a> fit.
pars	parameters to be selected.
...	arguments inherent from <a href="#">traceplot</a> .

## Value

see [traceplot](#).

## See Also

[spbp](#), [stan\\_dens.spbp](#), [extract.spbp](#)

## Examples

```
library("spsurv")  
data("veteran")  
  
fit <- bpph(Surv(time, status) ~ karno + factor(celltype),  
data = veteran)  
  
traceplot(fit)
```

---

vcov	<i>Generic S3 method vcov</i>
------	-------------------------------

---

**Description**

Generic S3 method vcov

**Usage**

```
vcov(spbp, ...)
```

**Arguments**

spbp	a fitted model object
...	further arguments passed to or from other methods.

**Value**

the variance-covariance matrix associated the regression coefficients.

---

vcov.spbp	<i>Covariance of the regression coefficients</i>
-----------	--

---

**Description**

Covariance of the regression coefficients

**Usage**

```
## S3 method for class 'spbp'  
vcov(spbp, ...)
```

**Arguments**

spbp	an object of the class spbp
...	further arguments passed to or from other methods.

**Value**

the variance-covariance matrix associated with the regression coefficients.



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