

# Package ‘BSR’

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**Title** BSR

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**Description** Bayesian Subset Regression

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**License** GPL-2

**Archs** i386, x64

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BSR

*BSR*

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### Description

BSR is a wrapper function to combine the functions BSR.samc, BSR.sample.model and BSR.prediction

### Usage

```
BSR(train.data, test.data, outdir, response.var, id.var, vars0, groups=NULL,  
     interactions=NULL, op=NULL)
```

## Arguments

<code>train.data</code>	Data frame containing only the variables to be used in the analysis. See details.
<code>test.data</code>	Data frame for testing that contains the same variables in the same order as <code>train.data</code> .
<code>outdir</code>	Directory where the output files will be written. If NULL, then the working directory will be used.
<code>response.var</code>	Variable name of the case-control response coded as 0=control, 1=case.
<code>id.var</code>	Variable name of the id variable or NULL if <code>train.data</code> and <code>test.data</code> do not contain an id variable.
<code>vars0</code>	Character vector of variables to always include in the models. Must be of length >= 1.
<code>groups</code>	NULL or a NAMED list of character vectors defining the groups. Each group of variables will always appear together in a model. For example, if "var1" and "var2" are dummy variables for a 3 level categorical variable, then <code>groups=list(group1=c("var1", "var2"))</code> will force variables var1 and var2 to always appear together in a model. If NULL, then each variable is its own group. Any variable in the data frames other than <code>response.var</code> and <code>id.var</code> which is not part of a group definition is treated as a group by itself. Example: <code>groups=list(grp1=c("var1", "var2"), grp2=c("x1", "x5", "x34"))</code> . The default is NULL.
<code>interactions</code>	NULL or a list of character vectors of GROUP names that must be in the model whenever the first GROUP name in the vector is in the model. The GROUP names must be a subset of the names in the <code>groups</code> list above, so that the <code>groups</code> argument must be specified to use this argument. This argument is used primarily for forcing the main effect variables of an interaction to be in the model whenever the interaction variable(s) are in the model. For instance, suppose that <code>grp1=c("x1", "x2")</code> is a group of dummy variables for a 3-level categorical variable, and that <code>grp2=c("z1", "z2", "z3")</code> is a group of dummy variables for a 4-level categorical variable. The interaction of the two categorical variables would be as group of 6 dummy variables <code>grp3=c("x1z1", "x1z2", "x1z3", "x2z1", "x2z2", "x2z3")</code> . If the <code>groups</code> argument is defined as <code>groups=list(grp1=c("x1", "x2"), grp2=c("z1", "z2", "z3"), grp3=c("x1z1", "x1z2", "x1z3", "x2z1", "x2z2", "x2z3"))</code> , then the <code>interactions</code> argument can be defined as <code>interactions=list(c("grp3", "grp1", "grp2"))</code> . Note that the first group in the vector is the group for the interaction variables. The default is NULL.
<code>op</code>	List of options. See <code>details</code> for all possible options.

## Details

The input data frames `train.data` and `test.data` will use ALL variables in the data frame as covariates except `response.var` and `id.var`. All variables except for `id.var` must be numeric and continuous. Any interactions, dummy variables for categorical variables, and a column of ones for the intercept must already exist in the data frames before calling this function.

### Options list:

Below are the names for the options list `op`. All names have default values if they are not specified.

- `out.string` String to be appended to output file names. The default is "".

- `train.op` Options list for training. See [BSR.samc](#). Note that the options `lowE` and `maxE` must be specified in this list. The default is `NULL`.
- `resample.op` Options list for resampling. See [BSR.sample.model](#). Note that the following options have no effect when calling the `BSR` function: `stepscale`, `lowE`, `maxE`, `scale`, `rho`, `maxvar`, `maxbeta`, `gamma`, `in_hist` and `in_models`. The default is `NULL`.
- `prediction.op` Options list for prediction. See [BSR.prediction](#). The default is `NULL`.

### Value

A list containing the prediction results (see [BSR.prediction](#)).

### Author(s)

Faming Liang, William Wheeler, Kai Yu

### References

Liang, F., Song, Q., and Yu, K. (2013). Bayesian Subset Modeling for High Dimensional Generalized Linear Models. *J. Amer. Statist. Assoc.*, in press

### See Also

[BSR.sample.model](#), [BSR.prediction](#), [BSR.samc](#)

### Examples

```
# Create data
set.seed(123)
n      <- 100
m      <- 50
y      <- rbinom(n, 1, 0.5)
id     <- paste("sub_", 1:n, sep="")
int    <- rep(1, n)
z1    <- rbinom(n, 1, 0.5)
z2    <- rbinom(n, 1, 0.5)
z3    <- runif(n)
z4    <- runif(n)
data  <- data.frame(y, id, int, z1, z2, z3, z4)

train.data <- data[1:m, ]
test.data  <- data[(m+1):n, ]
outdir     <- "c:/temp/"
vars0      <- "int" # The intercept variable

# Options for a small test run
train.op    <- list(lowE=0, maxE=1000, total_iteration=100, warm=10)
resample.op <- list(total_iteration=100, warm=10)
prediction.op <- list(n.burn=2)
op          <- list(train.op=train.op, resample.op=resample.op,
                     prediction.op=prediction.op, out.string="test")

# Not run
```

```
#ret <- BSR(train.data, test.data, outdir, "y", "id", vars0, groups=NULL,
#           interactions=NULL, op=op)
```

`BSR.prediction`      *BSR.prediction*

## Description

Uses models generated from `BSR.sample.model` to predict output for the training and testing datasets, and to estimate the prediction error based on the training (biased) and testing datasets.

## Usage

```
BSR.prediction(train.data, test.data, outdir, response.var, id.var,
               model.file, gof.file, best.file, op=NULL)
```

## Arguments

<code>train.data</code>	See <a href="#">BSR</a> .
<code>test.data</code>	See <a href="#">BSR</a> .
<code>outdir</code>	See <a href="#">BSR</a> .
<code>response.var</code>	See <a href="#">BSR</a> .
<code>id.var</code>	See <a href="#">BSR</a> .
<code>model.file</code>	Output file "out2" from <a href="#">BSR.sample.model</a> .
<code>gof.file</code>	Output file "out1" from <a href="#">BSR.sample.model</a> .
<code>best.file</code>	Output file "out_best" from <a href="#">BSR.sample.model</a> .
<code>op</code>	List of options. See <code>details</code> for all possible options.

## Details

### Options list:

Below are the names for the options list `op`. All names have default values if they are not specified.

- `n.burn` Specifies the first `n.burn` models from the output to remove. The default is 100.
- `out.string` Character string to include in the output files. The default is "".

## Value

A list of the output file names for the predicted training and testing data. Each file contains the columns "PRED.AVG", "PRED.BEST", `response.var` and `id.var`. The columns "PRED.AVG" and "PRED.BEST" are the average and best predicted values for each subject.

## Author(s)

Faming Liang, William Wheeler, Kai Yu

**See Also**

[BSR.sample.model](#), [BSR.samc](#), [BSR](#)

**Examples**

```

# Create data
set.seed(123)
n      <- 100
m      <- 50
y      <- rbinom(n, 1, 0.5)
id     <- paste("sub_", 1:n, sep="")
int    <- rep(1, n)
z1     <- rbinom(n, 1, 0.5)
z2     <- rbinom(n, 1, 0.5)
z3     <- runif(n)
z4     <- runif(n)
data  <- data.frame(y, id, int, z1, z2, z3, z4)

train.data <- data[1:m, ]
test.data  <- data[(m+1):n, ]
outdir     <- "c:/temp/"
vars0      <- "int"  # The intercept variable

# Options for a small test run
train.op   <- list(total_iteration=100, warm=10)
resample.op <- list(total_iteration=100, warm=10)
prediction.op <- list(n.burn=2)
op          <- list(train.op=train.op, resample.op=resample.op,
                     prediction.op=prediction.op, out.string="test")

#ret1 <- BSR.samc(train.data, outdir, "y", "id", vars0, groups=NULL,
#                   interactions=NULL, op=train.op)

#resample.op$in_models <- ret1$out_models
#resample.op$in_hist   <- ret1$out_hist
#ret2 <- BSR.sample.model(train.data, outdir, "y", "id", vars0, groups=NULL,
#                         interactions=NULL, op=resample.op)

#model.file <- ret2$out2
#gof.file   <- ret2$out1
#best.file  <- ret2$out_best
#ret <- BSR.prediction(train.data, test.data, outdir, "y", "id",
#                      model.file, gof.file, best.file, op=prediction.op)

```

**Description**

Apply SAMC to estimate the posterior distribution of the model. Four output files are generated. The .log file contains the summary of the model posterior distribution, such as the size, the best model for a given size, and the probability of a variable included in a model. The .hist file contains

the probability for each partition region estimated from the SAMC algorithm. The .out1 file contains the summary for each (biased) sampled model. The .out2 file contains the estimated coefficients for each model listed in the .out1 file. The .model file contains results for all the models that have been considered.

## Usage

```
BSR.samc(data, outdir, response.var, id.var, vars0, groups=NULL,
          interactions=NULL, op=NULL)
```

## Arguments

data	See <a href="#">BSR</a> .
outdir	See <a href="#">BSR</a> .
response.var	See <a href="#">BSR</a> .
id.var	See <a href="#">BSR</a> .
vars0	See <a href="#">BSR</a> .
groups	See <a href="#">BSR</a> .
interactions	See <a href="#">BSR</a> .
op	List of options. See <a href="#">details</a> for all possible options.

## Details

The input `data` frame will use all variables in the data frame as covariates except `response.var` and `id.var`. All variables except for `id.var` must be numeric and continuous. Rows with missing values will be removed from the analysis.

### Options list:

Below are the names for the options list `op`. All names have default values if they are not specified.

- `stepscale` This is the value called  $t_0$  in equation (26) from the paper by Liang (2013). The default is 1000.
- `total_iteration` Number of iterations. The default is 500000.
- `warm` The number of warm-up iterations. The default is 10000.
- `savestep` Number to output every `savestep` iterations. The default is 1.
- `lowE`, `maxE`, `scale` These options are used for defining the sample space partition according to the energy function. The lower and upper boundaries are defined by `lowE` and `maxE`. The option `scale` is used to control the number of subregions defined as  $(\text{maxE} - \text{lowE}) * \text{scale}$ . The default value of `scale` is 1, but `lowE` and `maxE` must be provided.
- `rho` The parameter for the SAMC algorithm. The default is 1.
- `temperature` The parameter for the MCMC move. The default is 1.
- `maxvar` Maximum number of variables in the regression model. The default is 20.
- `maxbeta` Maximum allowed value for  $\text{abs}(\beta)$  in the regression model. If the model has any  $\text{abs}(\beta) > \text{maxbeta}$ , then the model is rejected. The default is 10.
- `seed` The default seed is computed from the time.
- `gamma` The penalty parameter. The default is 0.5.
- `model_maxn` Maximum number of models to save. The default is 100000.
- `out.string` Character string to include in the output files. The default is "".
- `delete` 0 or 1 to delete the temporary files written to `outdir`. The default is 0.

**Value**

A list of the output files created in `outdir` and if the input data frame was modified, then the modified data frame is also returned.

**Author(s)**

Faming Liang, William Wheeler, Kai Yu

**See Also**

`BSR.sample.model`, `BSR.prediction`, `BSR`

**Examples**

```
# Create data
set.seed(123)
n      <- 100
m      <- 50
y      <- rbinom(n, 1, 0.5)
id     <- paste("sub_", 1:n, sep="")
int    <- rep(1, n)
z1     <- rbinom(n, 1, 0.5)
z2     <- rbinom(n, 1, 0.5)
z3     <- runif(n)
z4     <- runif(n)
data  <- data.frame(y, id, int, z1, z2, z3, z4)

outdir      <- "c:/temp/"
vars0       <- "int"  # The intercept variable

# Options for a small test run
op <- list(lowE=0, maxE=1000, total_iteration=100, warm=10)

# Not run
#ret <- BSR.samc(data, outdir, "y", "id", vars0, groups=NULL,
#                  interactions=NULL, op=op)
```

`BSR.sample.model`    *BSR.sample.model*

**Description**

Generates models from the posterior distribution estimated from `BSR.samc`. The `.out1` file contains the summary for each sampled model. The `.out2` file contains the estimated coefficients for each model listed in the `.out1` file. The `.best` file contains the best model among the sampled models.

**Usage**

```
BSR.sample.model(data, outdir, response.var, id.var, vars0, groups=NULL,
                 interactions=NULL, op=NULL)
```

## Arguments

data	See <a href="#">BSR</a> .
outdir	See <a href="#">BSR</a> .
response.var	See <a href="#">BSR</a> .
id.var	See <a href="#">BSR</a> .
vars0	See <a href="#">BSR</a> .
groups	See <a href="#">BSR</a> .
interactions	See <a href="#">BSR</a> .
op	List of options. See <a href="#">details</a> for all possible options.

## Details

### Options list:

The same options as in [BSR.samc](#) can be specified, except that the following options have no effect: stepscale, lowE, maxE, scale and rho. The options maxvar, maxbeta and gamma should to be set to the same values for when the [BSR.samc](#) function was called. There are also two additional options below for op.

- in\_models NULL or the "out\_models" file from [BSR.samc](#). The default is NULL.
- in\_hist The "out\_hist" file from [BSR.samc](#). This must be specified.

## Value

A list of the output files created in `outdir` and if the input data frame was modified, then the modified data frame is also returned.

## Author(s)

Faming Liang, William Wheeler, Kai Yu

## See Also

[BSR.samc](#), [BSR.prediction](#), [BSR](#)

## Examples

```
# Create data
set.seed(456)
n      <- 100
m      <- 50
y      <- rbinom(n, 1, 0.5)
id     <- paste("sub_", 1:n, sep="")
int    <- rep(1, n)
z1    <- rbinom(n, 1, 0.5)
z2    <- rbinom(n, 1, 0.5)
z3    <- runif(n)
z4    <- runif(n)
data  <- data.frame(y, id, int, z1, z2, z3, z4)

outdir      <- "c:/temp/"
```

```
vars0      <- "int"  # The intercept variable

# Options for a small test run
op <- list(total_iteration=100, warm=10)

# Not run
#ret <- BSR.sample.model(data, outdir, "y", "id", vars0, groups=NULL,
#                         interactions=NULL, op=op)
```

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