

# Package ‘moseg’

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**Type** Package

**Title** Data segmentation for sparse regression models

**Version** 0.1.0

**Imports** glmnet, MASS, doParallel, foreach, parallel, Matrix

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**Description**

Detects and locates change points in the sparse regression model, based on Lasso estimation and using moving sum (MOSUM) statistics.

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**Encoding** UTF-8

**LazyData** true

**RoxygenNote** 7.1.2

**Depends** R (>= 3.5.0)

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eqdata

*Equity premium and macro/financial variables***Description**

A dataset containing time series of the equity premium and other macro/financial variables

**Usage**

```
eqdata
```

**Format**

A data frame with 1032 rows and 16 variables:

**yyyymm** Date

**b.m** Book-to-Market Ratio

**tbl** Treasury Bills

**lty** Long Term Yield

**ntis** Net Equity Expansion

**infl** Inflation

**ltr** Long Term Rate of Returns

**svar** Stock Variance

**equity\_premium** Equity Premium

**dp** Dividend Price Ratio

**dy** Dividend Yield

**ep** Earnings Price Ratio

**de** Dividend Payout Ratio

**tms** Term Spread

**dfy** Default Yield Spread

**dfr** Default Return Spread

**Source**

<https://sites.google.com/view/agoyal145/?redirpath=/>

**References**

Welch, Ivo, and Amit Goyal. "A comprehensive look at the empirical performance of equity premium prediction." *The Review of Financial Studies* 21.4 (2008): 1455-1508.

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moseg	<i>Detect and estimate multiple change points in the sparse regression model</i>
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## Description

Detect and estimate multiple change points in the sparse regression model

## Usage

```
moseg(
  X,
  y,
  G = NULL,
  lambda = c("min", "1se"),
  family = c("gaussian", "binomial", "poisson"),
  threshold = NULL,
  n.cps = NULL,
  grid.resolution = 1/G,
  nu = 0.5,
  do.refinement = TRUE,
  do.plot = TRUE,
  do.scale = TRUE,
  ncores = 1,
  ...
)
```

## Arguments

X	design matrix
y	response vector
G	integer bandwidth; default is chosen based on dimensions of X
lambda	regularisation parameter; either a numeric, or one of "min", "1se" (see <a href="#">cv.glmnet</a> )
family	response type, one of "gaussian", "binomial", "poisson"
threshold	numeric test rejection threshold; see details for default
n.cps	chosen number of change points to return; if specified, overrides threshold
grid.resolution	controls number of subsamples to take
nu	numeric localisation tuning parameter
do.refinement	Boolean - perform location refinement
do.plot	Boolean - return plots
do.scale	Boolean - centre and scale X, y
ncores	number of parallel cores
...	optional arguments to glmnet

## Details

The default threshold is chosen as a product of exponents of  $\lambda$  and  $G$ . For a more accurate, but slightly slower, procedure, see [moseg.cv](#).

## Value

List containing

- mosum numeric vector of mosum detector
- cps integer vector of estimated change points
- refined.cps integer vector of refined change points
- G input
- lambda input
- threshold input
- grid.resolution input
- family input
- plots list of detector and refinement plots
- model\_list list of fitted glmnet models at each grid point

## Examples

```
eqX <- eqdata[,-c(1,9)]
eq_mosum <- moseg(as.matrix(eqX), eqdata[,9], 120, grid.resolution = 1/10, ncores = 2)
```

---

moseg.cv

*Detect and estimate multiple change points in the sparse regression model, selecting the number of change points using sample splitting*

---

## Description

Detect and estimate multiple change points in the sparse regression model, selecting the number of change points using sample splitting

## Usage

```
moseg.cv(
  X,
  y,
  G = NULL,
  lambda = NULL,
  max.cps = NULL,
  family = c("gaussian", "binomial", "poisson"),
  loss = c("1", "2"),
  folds = 2,
  path.length = 5,
```

```

    grid.resolution = 1/G,
    nu = 0.5,
    do.plot = TRUE,
    do.scale = TRUE,
    do.refinement = TRUE,
    ncores = 1,
    ...
)

```

## Arguments

X	design matrix
y	response vector
G	integer bandwidth; default is chosen based on dimensions of X
lambda	vector of numeric regularisation parameters
max.cps	maximum number of change points to consider
family	response type, one of "gaussian", "binomial", "poisson"
loss	l-norm for CV loss function, one of "1", "2"
folds	number of folds for CV
path.length	number of lambda values to consider
grid.resolution	controls number of subsamples to take
nu	numeric localisation tuning parameter
do.plot	Boolean - return plots
do.scale	Boolean - centre and scale X, y
do.refinement	Boolean - perform location refinement
ncores	number of parallel cores
...	optional arguments to glmnet

## Value

moseg.cv object containing

- mosum numeric vector of mosum detector
- cps integer vector of estimated change points
- refined.cps integer vector of refined change points
- G input
- lambda selected regularisation parameter
- threshold implied threshold
- detectors mosum detector series for each lambda value
- cv matrix of cross-validation errors
- model\_list list of fitted piecewise models
- plots list of detector and refinement plots
- family input

## Examples

```
eqX <- eqdata[,-c(1,9)]
eq_thr <- moseg.cv(as.matrix(eqX), as.matrix(eqdata[,9]), G=120, max.cps = 3, ncores = 2)
```

---

moseg.fit	<i>Fit a piecewise sparse regression model and evaluates a penalty. Fits a model to each stationary segment using glmnet::cv.glmnet.</i>
-----------	--

---

## Description

Fit a piecewise sparse regression model and evaluates a penalty. Fits a model to each stationary segment using `glmnet::cv.glmnet`.

## Usage

```
moseg.fit(
  X,
  y,
  cps,
  lambda = c("min", "1se"),
  family = c("gaussian", "binomial", "poisson"),
  type = c("link", "response", "coefficients", "nonzero", "class"),
  do.plot = TRUE,
  do.scale = TRUE,
  ...
)
```

## Arguments

X	design matrix
y	response vector
cps	vector of change point locations
lambda	regularisation parameter; either a numeric, or one of "min", "1se" (see <a href="#">cv.glmnet</a> )
family	response type, one of "gaussian", "binomial", "poisson"
type	type of prediction; see <code>?glmnet.predict</code>
do.plot	Boolean - return coefficient plot
do.scale	Boolean - scale X, y
...	optional arguments to <code>glmnet</code>

**Value**

list containing

- model list of fitted models
- likelihood likelihood value
- preds vector of fitted values for each time step
- coeffs coefficient matrix
- plot coefficient heatmap

**Examples**

```
eqX <- eqdata[,-c(1,9)]
eq_mosum <- moseg.fit(as.matrix(eqX), as.matrix(eqdata[,9]), c(500))
```

---

moseg.ms

*Detect and estimate multiple change points in the sparse regression model using multiple bandwidths*

---

**Description**

Detect and estimate multiple change points in the sparse regression model using multiple bandwidths

**Usage**

```
moseg.ms(
  X,
  y,
  Gset,
  lambda = c("min", "1se"),
  family = c("gaussian", "binomial", "poisson"),
  threshold = NULL,
  grid.resolution = NULL,
  nu = 0.5,
  do.plot = TRUE,
  do.scale = TRUE,
  ncores = 1,
  ...
)
```

**Arguments**

X	design matrix
y	response vector
Gset	integer vector of bandwidths; default is chosen based on dimensions of X

lambda	regularisation parameter; either a numeric, or one of "min", "1se" (see <a href="#">cv.glmnet</a> )
family	response type, one of "gaussian", "binomial", "poisson"
threshold	numeric test rejection threshold; see <a href="#">moseg</a> for default choice
grid.resolution	controls number of subsamples to take
nu	numeric localisation tuning parameter
do.plot	Boolean - return plots
do.scale	Boolean - scale X, y
ncores	number of parallel cores
...	optional arguments to glmnet

### Value

List containing

- cps integer vector of estimated change points
- plot multiscale plot
- moseg.G list of 'moseg' objects corresponding to 'Gset' in ascending order

### See Also

[moseg.ms.cv](#)

### Examples

```
eqX <- eqdata[,-c(1,9)]
eq_mosum <- moseg.ms(as.matrix(eqX), eqdata[,9], c(60,90,120), ncores = 2)
```

---

moseg.ms.cv	<i>Detect and estimate multiple change points in the sparse regression model using multiple bandwidths, selecting the number of change points using sample splitting</i>
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---

### Description

Detect and estimate multiple change points in the sparse regression model using multiple bandwidths, selecting the number of change points using sample splitting



**Usage**

```
moseg.ms.cv(
  X,
  y,
  Gset = NULL,
  lambda = NULL,
  family = c("gaussian", "binomial", "poisson"),
  loss = c("1", "2"),
  folds = 1,
  path.length = 5,
  threshold = NULL,
  grid.resolution = 1/Gset,
  nu = 0.5,
  do.plot = TRUE,
  do.scale = TRUE,
  ncores = 1,
  ...
)
```

**Arguments**

X	design matrix
y	response vector
Gset	integer vector of bandwidths; default is chosen based on dimensions of X
lambda	regularisation parameter; either a numeric, or one of "min", "1se" (see <a href="#">cv.glmnet</a> )
family	response type, one of "gaussian", "binomial", "poisson"
loss	l-norm for CV loss function, one of "1", "2"
folds	number of folds for CV
path.length	number of lambda values to consider
threshold	numeric test rejection threshold; see reference for default choice
grid.resolution	controls number of subsamples to take
nu	numeric localisation tuning parameter
do.plot	Boolean - return plots
do.scale	Boolean - scale X, y
ncores	number of parallel cores
...	optional arguments to glmnet

**Value**

moseg.ms.cv object containing

- anchors integer vector of estimated change points
- refined.cps integer vector of refined change points
- moseg.G list of 'moseg.cv' objects corresponding to 'Gset' in ascending order

**Examples**

```
eqX <- eqdata[,-c(1,9)]
eq_mosum <- moseg.ms.cv(as.matrix(eqX), eqdata[,9], c(60,90,120), ncores = 2)
```

---

moseg.sim

*Simulate from a sparse piecewise regression model*


---

**Description**

Simulate from a sparse piecewise regression model

**Usage**

```
moseg.sim(
  n,
  p,
  sparsity = floor(sqrt(p)),
  q = 1,
  sigma.noise = 1,
  sigma.x = c("id", "band", "ar"),
  kappa = 1
)
```

**Arguments**

n	sample size
p	number of parameters
sparsity	number of non-zero parameters
q	number of change points
sigma.noise	error standard deviation
sigma.x	covariance structure of X, one of "id", "band", "ar"
kappa	change size

**Value**

List containing

- y response vector
- X matrix of covariates
- cps vector of change points
- beta matrix of parameters corresponding to each regime

and all inputs

**Examples**

```
moseg.sim(100, 50)
```

---

plot.moseg	<i>Plot the moseg detector</i>
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---

**Description**

Plotting method for S3 objects of class moseg.

**Usage**

```
## S3 method for class 'moseg'  
plot(x, ...)
```

**Arguments**

x	moseg object
...	unused

**Value**

A detector plot

---

plot.moseg.cv	<i>Plot the moseg detector</i>
---------------	--------------------------------

---

**Description**

Plotting method for S3 objects of class moseg.cv.

**Usage**

```
## S3 method for class 'moseg.cv'  
plot(x, type = c("cv", "mosum"), ...)
```

**Arguments**

x	moseg.cv object
type	plot type, one of "cv", "mosum"
...	unused

**Value**

A cv or detector plot

---

plot.moseg.ms	<i>Plot the multiscale moseg detector</i>
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---

**Description**

Plotting method for S3 objects of class moseg.ms.

**Usage**

```
## S3 method for class 'moseg.ms'  
plot(x, ...)
```

**Arguments**

x	moseg.ms object
...	unused

**Value**

Detector plots

---

plot.moseg.ms.cv	<i>Plot the multiscale moseg.cv detector</i>
------------------	--

---

**Description**

Plotting method for S3 objects of class moseg.ms.cv.

**Usage**

```
## S3 method for class 'moseg.ms.cv'  
plot(x, type = c("cv", "mosum"), ...)
```

**Arguments**

x	moseg.ms object
type	plot type, one of "cv", "mosum"
...	unused

**Value**

cv or detector plots

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