

Package ‘basefun’

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Title Infrastructure for Computing with Basis Functions

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Description Some very simple infrastructure for basis functions.

Depends variables (\geq 1.1-0), R (\geq 3.2.0)

Imports stats, polynom, Matrix, orthopolynom, methods

Suggests coneproj

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basefun-package

*General Information on the **basefun** Package*

Description

The **basefun** package offers a small collection of objects for handling basis functions and corresponding methods.

The package was written to support the **mlt** package and will be of limited use outside this package.

Author(s)

This package is authored by Torsten Hothorn <Torsten.Hothorn@R-project.org>.

References

Torsten Hothorn (2018), Most Likely Transformations: The mlt Package, *Journal of Statistical Software*, forthcoming. URL: <https://cran.r-project.org/package=mlt.docreg>

as.basis

Convert Formula or Factor to Basis Function

Description

Convert a formula or factor to basis functions

Usage

```
as.basis(object, ...)
## S3 method for class 'formula'
as.basis(object, data = NULL, remove_intercept = FALSE,
         ui = NULL, ci = NULL, negative = FALSE, scale = FALSE,
         Matrix = FALSE, prefix = "", ...)
## S3 method for class 'factor_var'
as.basis(object, ...)
## S3 method for class 'ordered_var'
as.basis(object, ...)
## S3 method for class 'factor'
as.basis(object, ...)
## S3 method for class 'ordered'
as.basis(object, ...)
```

Arguments

| | |
|------------------|--|
| object | a formula or an object of class factor, factor_var, ordered or ordered_var |
| data | either a vars object or a data.frame |
| remove_intercept | a logical indicating if any intercept term shall be removed |
| ui | a matrix defining constraints |
| ci | a vector defining constraints |
| negative | a logical indicating negative basis functions |
| scale | a logical indicating a scaling of each column of the model matrix to the unit interval (based on observations in data) |
| Matrix | a logical requesting a sparse model matrix, that is, a Matrix object. |
| prefix | character prefix for model matrix column names (allows disambiguation of parameter names). |
| ... | additional arguments to model.matrix, for example contrasts |

Details

as.basis returns a function for the evaluation of the basis functions with corresponding model.matrix and predict methods.

Unordered factors (classes factor and factor_var) use a dummy coding and ordered factor (classes ordered or ordered_var) lead to a treatment contrast to the last level and removal of the intercept term with monotonicity constraint. Additional arguments (...) are ignored for ordered factors.

Linear constraints on parameters parm are defined by `ui %>% parm >= ci`.

Examples

```
## define variables and basis functions
v <- c(numeric_var("x"), factor_var("y", levels = LETTERS[1:3]))
fb <- as.basis(~ x + y, data = v, remove_intercept = TRUE, negative = TRUE,
              contrasts.arg = list(y = "contr.sum"))

## evaluate basis functions
model.matrix(fb, data = as.data.frame(v, n = 10))
## basically the same as (but wo intercept and times -1)
model.matrix(~ x + y, data = as.data.frame(v, n = 10))

### factor
xf <- gl(3, 1)
model.matrix(as.basis(xf), data = data.frame(xf = xf))

### ordered
xf <- gl(3, 1, ordered = TRUE)
model.matrix(as.basis(xf), data = data.frame(xf = unique(xf)))
```

b

*Box Product of Basis Functions***Description**

Box product of two basis functions

Usage

```
b(..., sumconstr = FALSE)
```

Arguments

... named objects of class basis
sumconstr a logical indicating if sum constraints shall be applied

Details

b() joins the corresponding design matrices by the row-wise Kronecker (or box) product.

Examples

```
### set-up a Bernstein polynomial
xv <- numeric_var("x", support = c(1, pi))
bb <- Bernstein_basis(xv, order = 3, ui = "increasing")
## and treatment contrasts for a factor at three levels
fb <- as.basis(~ g, data = factor_var("g", levels = LETTERS[1:3]))

### join them: we get one intercept and two deviation _functions_
bfb <- b(bern = bb, f = fb)

### generate data + coefficients
x <- expand.grid(mkgrid(bfb, n = 10))
cf <- c(1, 2, 2.5, 2.6)
cf <- c(cf, cf + 1, cf + 2)

### evaluate bases
model.matrix(bfb, data = x)

### plot functions
plot(x$x, predict(bfb, newdata = x, coef = cf), type = "p",
     pch = (1:3)[x$g])
legend("bottomright", pch = 1:3,
      legend = colnames(model.matrix(fb, data = x)))
```

| | |
|-----------------|----------------------------------|
| Bernstein_basis | <i>Bernstein Basis Functions</i> |
|-----------------|----------------------------------|

Description

Basis functions defining a polynomial in Bernstein form

Usage

```
Bernstein_basis(var, order = 2, ui = c("none", "increasing", "decreasing",
                                       "cyclic", "zerointegral", "positive",
                                       "negative", "concave", "convex"),
               extrapolate = FALSE, log_first = FALSE)
```

Arguments

| | |
|-------------|--|
| var | a <code>numeric_var</code> object |
| order | the order of the polynomial, one defines a linear function |
| ui | a character describing possible constraints |
| extrapolate | logical; if TRUE, the polynomial is extrapolated linearly outside <code>support(var)</code> . In particular, the second derivative of the polynomial at <code>support(var)</code> is constrained to zero. |
| log_first | logical; the polynomial in Bernstein form is defined on the log-scale if TRUE. It makes sense to define the support as <code>c(1, q)</code> , ie putting the first basis function of the polynomial on <code>log(1)</code> . |

Details

`Bernstein_basis` returns a function for the evaluation of the basis functions with corresponding `model.matrix` and `predict` methods.

References

Rida T. Farouki (2012), The Bernstein Polynomial Basis: A Centennial Retrospective, *Computer Aided Geometric Design*, **29**(6), 379–419. <http://dx.doi.org/10.1016/j.cagd.2012.03.001>

Examples

```
### set-up basis
bb <- Bernstein_basis(numeric_var("x", support = c(0, pi)),
                     order = 3, ui = "increasing")

### generate data + coefficients
x <- as.data.frame(mkgrid(bb, n = 100))
cf <- c(1, 2, 2.5, 2.6)
```

```

### evaluate basis (in two equivalent ways)
bb(x[1:10],,drop = FALSE]
model.matrix(bb, data = x[1:10], ,drop = FALSE])

### check constraints
cnstr <- attr(bb(x[1:10],,drop = FALSE]), "constraint")
all(cnstr$ui %>% cf > cnstr$ci)

### evaluate and plot Bernstein polynomial defined by
### basis and coefficients
plot(x$x, predict(bb, newdata = x, coef = cf), type = "l")

### evaluate and plot first derivative of
### Bernstein polynomial defined by basis and coefficients
plot(x$x, predict(bb, newdata = x, coef = cf, deriv = c(x = 1)),
      type = "l")

### illustrate constrained estimation by toy example
N <- 100
order <- 10
x <- seq(from = 0, to = pi, length.out = N)
y <- rnorm(N, mean = -sin(x) + .5, sd = .5)

if (require("coneproj")) {
  prnt_est <- function(ui) {
    xv <- numeric_var("x", support = c(0, pi))
    xb <- Bernstein_basis(xv, order = 10, ui = ui)
    X <- model.matrix(xb, data = data.frame(x = x))
    uiM <- as(attr(X, "constraint")$ui, "matrix")
    ci <- attr(X, "constraint")$ci
    if (all(is.finite(ci)))
      parm <- qprog(crossprod(X), crossprod(X, y),
                   uiM, ci, msg = FALSE)$thetahat
    else
      parm <- coef(lm(y ~ 0 + X))
    plot(x, y, main = ui)
    lines(x, X %>% parm, col = col[ui], lwd = 2)
  }
  ui <- eval(formals(Bernstein_basis)$ui)
  col <- 1:length(ui)
  names(col) <- ui
  layout(matrix(1:length(ui),
               ncol = ceiling(sqrt(length(ui))))))
  tmp <- sapply(ui, function(x) try(prnt_est(x)))
}

```

c.basis

Join Basis Functions

Description

Concatenate basis functions column-wise

Usage

```
## S3 method for class 'basis'  
c(..., recursive = FALSE)
```

Arguments

```
...          named objects of class basis  
recursive    always FALSE
```

Details

c() joins the corresponding design matrices column-wise, ie, the two functions defined by the two bases are added.

Examples

```
### set-up Bernstein and log basis functions  
xv <- numeric_var("x", support = c(1, pi))  
bb <- Bernstein_basis(xv, order = 3, ui = "increasing")  
lb <- log_basis(xv, remove_intercept = TRUE)  
  
### join them  
blb <- c(bern = bb, log = lb)  
  
### generate data + coefficients  
x <- as.data.frame(mkgrid(blb, n = 100))  
cf <- c(1, 2, 2.5, 2.6, 2)  
  
### evaluate bases  
model.matrix(blb, data = x[1:10], ,drop = FALSE])  
  
### evaluate and plot function defined by  
### bases and coefficients  
plot(x$x, predict(blb, newdata = x, coef = cf), type = "l")  
  
### evaluate and plot first derivative of function  
### defined by bases and coefficients  
plot(x$x, predict(blb, newdata = x, coef = cf, deriv = c(x = 1)),  
      type = "l")
```

intercept_basis

Intercept-Only Basis Function

Description

A simple intercept as basis function

Usage

```
intercept_basis(ui = c("none", "increasing", "decreasing"), negative = FALSE)
```

Arguments

`ui` a character describing possible constraints
`negative` a logical indicating negative basis functions

Details

`intercept_basis` returns a function for the evaluation of the basis functions with corresponding `model.matrix` and `predict` methods.

Examples

```
### set-up basis
ib <- intercept_basis()

### generate data + coefficients
x <- as.data.frame(mkgrid(ib))

### 2 * 1
predict(ib, newdata = x, coef = 2)
```

Legendre_basis

Legendre Basis Functions

Description

Basis functions defining a Legendre polynomial

Usage

```
Legendre_basis(var, order = 2, ui = c("none", "increasing", "decreasing",
                                     "cyclic", "positive", "negative"), ...)
```

Arguments

`var` a `numeric_var` object
`order` the order of the polynomial, one defines a linear function
`ui` a character describing possible constraints
`...` additional arguments passed to `legendre.polynomials`

Details

Legendre_basis returns a function for the evaluation of the basis functions with corresponding model.matrix and predict methods.

References

Rida T. Farouki (2012), The Bernstein Polynomial Basis: A Centennial Retrospective, *Computer Aided Geometric Design*, **29**(6), 379–419. <http://dx.doi.org/10.1016/j.cagd.2012.03.001>

Examples

```
### set-up basis
lb <- Legendre_basis(numeric_var("x", support = c(0, pi)),
                    order = 3)

### generate data + coefficients
x <- as.data.frame(mkgrid(lb, n = 100))
cf <- c(1, 2, 2.5, 1.75)

### evaluate basis (in two equivalent ways)
lb(x[1:10],,drop = FALSE]
model.matrix(lb, data = x[1:10], ,drop = FALSE])

### evaluate and plot Legendre polynomial defined by
### basis and coefficients
plot(x$x, predict(lb, newdata = x, coef = cf), type = "l")
```

log_basis

Logarithmic Basis Function

Description

The logarithmic basis function

Usage

```
log_basis(var, ui = c("none", "increasing", "decreasing"),
          remove_intercept = FALSE)
```

Arguments

var a `numeric_var` object
ui a character describing possible constraints
remove_intercept a logical indicating if the intercept term shall be removed

Details

log_basis returns a function for the evaluation of the basis functions with corresponding model.matrix and predict methods.

Examples

```
### set-up basis
lb <- log_basis(numeric_var("x", support = c(0.1, pi)))

### generate data + coefficients
x <- as.data.frame(mkgrid(lb, n = 100))

### 1 + 2 * log(x)
max(abs(predict(lb, newdata = x, coef = c(1, 2)) - (1 + 2 * log(x$x))))
```

polynomial_basis *Polynomial Basis Functions*

Description

Basis functions defining a polynomial

Usage

```
polynomial_basis(var, coef, ui = NULL, ci = NULL)
```

Arguments

| | |
|------|--|
| var | a <code>numeric_var</code> object |
| coef | a logical defining the order of the polynomial |
| ui | a matrix defining constraints |
| ci | a vector defining constraints |

Details

polynomial_basis returns a function for the evaluation of the basis functions with corresponding model.matrix and predict methods.

Examples

```
### set-up basis of order 3 ommiting the quadratic term
pb <- polynomial_basis(numeric_var("x", support = c(0, pi)),
                       coef = c(TRUE, TRUE, FALSE, TRUE))

### generate data + coefficients
```

```

x <- as.data.frame(mkgrid(pb, n = 100))
cf <- c(1, 2, 0, 1.75)

### evaluate basis (in two equivalent ways)
pb(x[1:10], drop = FALSE)
model.matrix(pb, data = x[1:10], drop = FALSE)

### evaluate and plot polynomial defined by
### basis and coefficients
plot(x$x, predict(pb, newdata = x, coef = cf), type = "l")

```

predict.basis

Evaluate Basis Functions

Description

Evaluate basis functions and compute the function defined by the corresponding basis

Usage

```

## S3 method for class 'basis'
predict(object, newdata, coef, dim = !is.data.frame(newdata), ...)
## S3 method for class 'cbind_bases'
predict(object, newdata, coef, dim = !is.data.frame(newdata),
        terms = names(object), ...)
## S3 method for class 'box_bases'
predict(object, newdata, coef, dim = !is.data.frame(newdata), ...)

```

Arguments

| | |
|---------|--|
| object | a basis or bases object |
| newdata | a list or data.frame |
| coef | a vector of coefficients |
| dim | either a logical indicating that the dimensions shall be obtained from the bases object or an integer vector with the corresponding dimensions (the latter option being very experimental) |
| terms | a character vector defining the elements of a cbind_bases object to be evaluated |
| ... | additional arguments |

Details

predict evaluates the basis functions and multiplies them with coef. There is no need to expand multiple variables as predict uses array models (Currie et al, 2006) to compute the corresponding predictions efficiently.

References

Ian D. Currie, Maria Durban, Paul H. C. Eilers, P. H. C. (2006), Generalized Linear Array Models with Applications to Multidimensional Smoothing, *Journal of the Royal Statistical Society, Series B: Methodology*, **68**(2), 259–280.

Examples

```
### set-up a Bernstein polynomial
xv <- numeric_var("x", support = c(1, pi))
bb <- Bernstein_basis(xv, order = 3, ui = "increasing")
## and treatment contrasts for a factor at three levels
fb <- as.basis(~ g, data = factor_var("g", levels = LETTERS[1:3]))

### join them: we get one intercept and two deviation _functions_
bfb <- b(bern = bb, f = fb)

### generate data + coefficients
x <- mkgrid(bfb, n = 10)
cf <- c(1, 2, 2.5, 2.6)
cf <- c(cf, cf + 1, cf + 2)

### evaluate predictions for all combinations in x (a list!)
predict(bfb, newdata = x, coef = cf)

## same but slower
matrix(predict(bfb, newdata = expand.grid(x), coef = cf), ncol = 3)
```

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