Package ‘merlin’

June 29, 2020

Version  0.1.0
Title  Mixed Effects Regression for Linear, Non-Linear and User-Defined Models

Description  Fits linear, non-linear, and user-defined mixed effects regression models following the framework developed by Crowther (2017) <arXiv:1710.02223>. ’merlin’ can fit multivariate outcome models of any type, each of which could be repeatedly measured (longitudinal), with any number of levels, and with any number of random effects at each level. Standard distributions/models available include the Bernoulli, Gaussian, Poisson, beta, negative-binomial, and time-to-event/survival models include the exponential, Gompertz, Royston-Parmar, Weibull and general hazard model. ’merlin’ provides a flexible predictor syntax, allowing the user to define variables, random effects, spline and fractional polynomial functions, functions of other outcome models, and any interaction between each of them. Non-linear and time-dependent effects are seamlessly incorporated into the predictor. ’merlin’ allows multivariate normal random effects, which are integrated out using Gaussian quadrature or Monte-Carlo integration. Note, ’merlin’ is based on the ‘Stata’ package of the same name, described in Crowther (2018) <arXiv:1806.01615>.

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Author  Emma Martin [aut],
        Alessandro Gasparini [aut],
        Michael Crowther [aut, cre]
Maintainer  Michael Crowther <michael.crowther@le.ac.uk>
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**Description**

`coef` extracts model coefficients from a `merlin` model fit. `coefficients` is an alias for it.

**Usage**

```r
## S3 method for class 'merlin'
coef(object, ...)

## S3 method for class 'summary.merlin'
coef(object, ...)
```

**Arguments**

- `object`: An object of class `merlin` or `summary.merlin`.
- `...`: Not used.

**Description**

`coef` extracts model coefficients from a `mlrcs` model fit. `coefficients` is an alias for it.

**Usage**

```r
## S3 method for class 'mlrcs'
coef(object, ...)

## S3 method for class 'summary.mlrcs'
coef(object, ...)
```

**Arguments**

- `object`: An object of class `mlrcs` or `summary.mlrcs`.
- `...`: Not used.
**Extract Model Coefficients**

### Description

`coef` extracts model coefficients from a `mlsurv` model fit. `coefficients` is an alias for it.

### Usage

```r
## S3 method for class 'mlsurv'
coef(object, ...)

## S3 method for class 'summary.mlsurv'
coef(object, ...)
```

### Arguments

- **object**
  An object of class `mlsurv` or `summary.mlsurv`.
- **...**
  Not used.

---

**heart.valve**

### Aortic valve replacement surgery data

This is longitudinal data on an observational study on detecting effects of different heart valves, differing on type of tissue, implanted in the aortic position. The data consists of longitudinal measurements on three different heart function outcomes, after surgery occurred. There are several baseline covariates available, and also survival data.

### Usage

```r
data(heart.valve)

data(heart.valve.merlin)
```

### Format

This is a data frame in the unbalanced format, that is, with one row per observation. The data consists in columns for patient identification, time of measurements, longitudinal multiple longitudinal measurements, baseline covariates, and survival data. The column names are identified as follows:

- **num** number for patient identification.
- **sex** gender of patient (0=Male and 1=Female).
- **age** age of patient at day of surgery (years).
time observed time point, with surgery date as the time origin (years).
fuhrs maximum follow up time, with surgery date as the time origin (years).
status censoring indicator (1=died and 0=lost at follow up).
grad valve gradient at follow-up visit.
log.grad natural log transformation of grad.
1vmi left ventricular mass index (standardised) at follow-up visit.
log.1vmi natural log transformation of 1vmi.
ef ejection fraction at follow-up visit.
bsa preoperative body surface area.
1vh preoperative left ventricular hypertrophy.
prenyha preoperative New York Heart Association (NYHA) classification (1=I/II and 3=III/IV).
redo previous cardiac surgery.
size size of the valve (millimetres).
con.cabg concomitant coronary artery bypass graft.
creat preoperative serum creatinine (µmol/mL).
sm preoperative diabetes.
acei preoperative use of ace inhibitor.
1v preoperative left ventricular ejection fraction (LVEF) (1=good, 2=moderate, and 3=poor).
emergenc operative urgency (0=elective, 1=urgent, and 3=emergency).
hc preoperative high cholesterol (0=absent, 1=present treated, and 2=present untreated).
sten.reg.mix aortic valve haemodynamics (1=stenosis, 2=regurgitation, 3=mixed).
hs implanted aortic prosthesis type (1=homograft and 0=stentless porcine tissue).

An object of class data.frame with 629 rows and 29 columns.

Note

heart.valve.merlin is a version of the heart.valve dataset in merlin format.

Source

Mr Eric Lim (http://www.drericlim.com)

References

logLik.merlin  Extract Log-Likelihood

Description

Extract log-likelihood of a merlin model.

Usage

```r
## S3 method for class 'merlin'
logLik(object, ...)
```

```r
## S3 method for class 'summary.merlin'
logLik(object, ...)
```

Arguments

- **object**: An object of class merlin or summary.merlin.
- **...**: Not used.

logLik.mlrcs  Extract Log-Likelihood

Description

Extract log-likelihood of a mlrcs model.

Usage

```r
## S3 method for class 'mlrcs'
logLik(object, ...)
```

```r
## S3 method for class 'summary.mlrcs'
logLik(object, ...)
```

Arguments

- **object**: An object of class mlrcs or summary.mlrcs.
- **...**: Not used.
Description

Extract log-likelihood of a mlsurv model.

Usage

```r
## S3 method for class 'mlsurv'
logLik(object, ...)

## S3 method for class 'summary.mlsurv'
logLik(object, ...)
```

Arguments

- `object`: An object of class mlsurv or summary.mlsurv.
- `...`: Not used.

merlin - Mixed Effects Regression for Linear, Nonlinear and User-defined models

Description

merlin fits linear, non-linear and user-defined mixed effects regression models. merlin can fit multivariate outcome models of any type, each of which could be repeatedly measured (longitudinal), with any number of levels, and with any number of random effects at each level. Standard distributions/models available include the Bernoulli, Gaussian, Poisson, beta, negative-binomial, and time-to-event/survival models include the exponential, Gompertz, Weibull, Royston-Parmar, and general hazard model. merlin provides a flexible predictor syntax, allowing the user to define variables, random effects, spline and fractional polynomial functions, functions of other outcome models, and any interaction between each of them. Non-linear and time-dependent effects are seamlessly incorporated into the predictor. merlin allows multivariate normal random effects, which are integrated out using Gaussian quadrature or Monte-Carlo integration. Relative survival (excess hazard) models are supported. Utility functions are provided to allow user-defined models to be specified, in conjunction with the complex predictor.
Usage

merlin(
  model,
  from = NULL,
  family = "gaussian",
  link = NULL,
  timevar = NULL,
  covariance = "diagonal",
  data,
  userf = NULL,
  sweight = NULL,
  levels = NULL,
  predict = FALSE,
  predtype = NULL,
  predmodel = NULL,
  causes = NULL,
  at = NULL,
  contrast = NULL,
  modelfit = NULL,
  control = list()
)

Arguments

  model specify the fixed and random elements for each model outcome. Where there are
  multiple outcomes, the models should be specified in a list. Each model should
  be specified as a formula (e.g. y~x). A number of different element types can be
  specified, including

  • varname - an independent variable from the data set
  • random-effects - a random-effect at the cluster level can be specified using
    M#cluster level], for example M[id] would define a random intercept
    at the ID level. Each independent random-effect should be given a unique
    name, if two random-effects are given the same name they will be treated
    as shared random-effects.
  • rcs() - restricted cubic spline terms, this option can be used to include a
    restricted cubic spline function, with the degrees of freedom (number of
    spline terms) specified using the df sub-option, with the boundary knots
    assumed to be at the minimum and maximum of the variable, with internal
    knots placed at equally spaced centiles. Other default options orthog =
    TRUE, which by default orthogonalises the splines, log = FALSE, which
    can be used to calculate splines of the log of the variable and event = F, which
    can be used to calculate the internal knots based only on observations that
    experienced the event of interest (for survival models).
  • srcs() is a shorthand element, equivalent to rcs(...,log = TRUE,event = TRUE), for use with survival models.
  • fp() - fractional polynomials of order 1 or 2 can be specified, the sub-
    option powers is used to specify the powers of the fp model.
• EV[depvar] - the expected value of the response of a submodel.
• dEV[depvar] - the first derivative with respect to time of the expected value of the response of a submodel.
• d2EV[depvar] - the second derivative with respect to time of the expected value of the response of a submodel.
• iEV[depvar] - the integral with respect to time of the expected value of the response of a submodel.
• XB[depvar] - the expected value of the complex predictor of a submodel.
• dXB[depvar] - the first derivative with respect to time of the expected value of the complex predictor of a submodel.
• d2XB[depvar] - the second derivative with respect to time of the expected value of the complex predictor of a submodel.
• iXB[depvar] - the integral with respect to time of the expected value of the complex predictor of a submodel.
• bhazard(varname) - invokes a relative survival (excess hazard) model. varname specifies the expected hazard rate at the event time.
• exposure(varname) - include log(varname) in the linear predictor, with a coefficient of 1. For use with family = "poisson".
• ap(#) - defines the number of ancillary parameters. Used with family="user".

from this is an optional argument giving the initial values for the full parameter vector, for more details on how to specify the initial estimates see the vignette.

family a vector of strings specifying the family for each outcome specified in model. The currently available models include,
• gaussian - Gaussian distribution
• bernoulli - Bernoulli distribution
• poisson - Poisson distribution
• beta - Beta distribution
• negbinomial - Negative binomial distribution

with survival models including,
• exponential - exponential distribution
• weibull - Weibull distribution
• gompertz - Gompertz distribution
• rp - Royston-Parmar model (complex predictor on the log cumulative hazard scale)
• loghazard - general log hazard model (complex predictor on the log hazard scale)

and user-defined,
• user - fit a user-defined model, which should be written using merlin's utility functions. The name of your user-defined function should be passed through the userf option.
• null - is a convenience tool to define additional complex predictors, that do not contribute to the log likelihood. For use with family = "user".
**link**

string vector defining the link functions for each model. Default is "identity" for all models. If specified, you must define a link function for all submodels. Options include "identity", "log" and "logit".

**timevar**

specifies the variable which represents time, this is necessary when a function of time is used in the linear predictor of a survival model as it may interact with other elements of the model.

**covariance**

the structure of the variance-covariance matrix can be varied, the default is diagonal where all diagonal elements of the variance-covariance matrix are estimated uniquely, identity assumes all diagonal elements are equal and unstructured estimates all elements of the variance-covariance matrix.

**data**

a data frame containing all variables required for fitting the model. Can be a tibble object.

**userf**

string vector defining the name of the user-written functions for each family="user". Each function must be in memory and should return the observation level contribution to the log-likelihood.

**sweights**

Not documented.

**levels**

if the model contains random-effects then a vector giving the order of levels must be specified, from the highest level to the lowest, e.g. levels=c("practice","id").

**predict**

Not documented.

**predtype**

Not documented.

**predmodel**

Not documented.

**causes**

Not documented.

**at**

Not documented.

**contrast**

Not documented.

**modelfit**

Not documented.

**control**

A list of parameters that control the estimation algorithm. Generally it should not be modified, unless there are convergence issues. Possible values are:

- **ip** An optional vector of integers specifying the number of integration points to be used when integrating out the random effects. A different number of ip can be specified for each level (from highest to lowest level). If only a single number is given then merlin will assume that number of integration points at all levels. Default is ip = 7 for each level using Gauss-Hermite quadrature, or ip = 100 for each level using Monte-Carlo integration;

- **intmethod** The method used for numerically integrating out the random-effects in order to calculate the likelihood for a mixed effects model which includes random effects. Options include ghermite for non-adaptive Gauss-Hermite quadrature, halton for Monte-Carlo integration using Halton sequences, sobol for Monte-Carlo integration using Sobol sequences, or mc for standard Monte-Carlo integration using normal draws. The default is ghermite. Level-specific integration techniques can be specified, for example, with a three level model, we may use Gauss-Hermite quadrature at the highest level, and Monte-Carlo integration with Halton sequences at level 2, using intmethod = c("ghermite","halton").
• debug Not documented.
• verbose Not documented.
• optim.method The optim method to be used. Defaults to Nelder-Mead, see optim for available methods.
• maxit The maximum number of iterations for the optimisation routine. Defaults to 5000.

Author(s)
Emma C. Martin, Alessandro Gasparini and Michael J. Crowther

References
Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear, non-linear and user-defined models.

See Also
predict.merlin
merlin_util_depvar, merlin_util_timevar, merlin_util_xzb, merlin_util_xzb_mod, merlin_util_xzb_deriv, merlin_util_xzb_deriv_mod, merlin_util_xzb_deriv2, merlin_util_xzb_deriv2_mod, merlin_util_xzb_integ, merlin_util_xzb_integ_mod, merlin_util_ev, merlin_util_ev_mod, merlin_util_ev_deriv, merlin_util_ev_deriv_mod, merlin_util_ev_deriv2, merlin_util_ev_deriv2_mod, merlin_util_ev_integ, merlin_util_ev_integ_mod, merlin_util_ap, merlin_util_ap_mod

Examples
## Not run:
library(merlin)
data(pbc.merlin, package = "merlin")

# Linear fixed-effects model
merlin(logb ~ year,
  family = "gaussian",
  data = pbc.merlin)

# Linear mixed-effects model with random intercept and slope at ID level
merlin(logb ~ year + M1[id] * 1 + year:M2[id] * 1,
  family = "gaussian",
  levels = "id",
  data = pbc.merlin)

# Joint longitudinal and survival model with shared random effects
merlin(model = list(logb ~ year + M1[id] * 1,
  Surv(stime, died) ~ trt + M1[id]),
  family = c("gaussian", "weibull"),
levels = "id",
data = pbc.merlin)

# Joint longitudinal and survival model with expected value
merlin(model = list(logb ~ year + M1[id] * 1,
               Surv(stime, died) ~ trt + EV[logb]),
       family = c("gaussian", "weibull"),
       levels = "id",
       timevar = c("year", "stime"),
       data = pbc.merlin)

# Gaussian distribution - implemented as a user-written family

logl_gaussian <- function(gml)
{
  y <- merlin_util_depvar(gml)
  xzb <- merlin_util_xzb(gml)
  se <- exp(merlin_util_ap(gml,1))

  mu <- (sweep(xzb,1,y,"-")^2)
  logl <- ((-0.5 * log(2*pi) - log(se)) - (mu/(2 * se^2)))
  return(logl)
}

merlin(logb ~ year + ap(1), family = "user", data = pbc.merlin,
       userf = "logl_gaussian")

# 3-level Weibull model
merlin(Surv(stime1,dead1) ~ age + M1[id1]*1 + M2[id2]*1,
       levels=c("id1","id2"), family="weibull", data=sim3)

## End(Not run)

---

merlin_util_ap  

**merlin_util_ap** - returns the current estimate of the ith ancillary parameter for the associated model

### Description

merlin_util_ap - returns the current estimate of the ith ancillary parameter for the associated model

### Usage

```
merlin_util_ap(gml, i)
```

### Arguments

- `gml`  
  merlin object - should not be edited
- `i`  
  index for which ancillary parameter to extract
Author(s)
Michael J. Crowther

References
Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

merlin_util_ap_mod  

Description
merlin_util_ap_mod - returns the current estimate of the ith ancillary parameter for the specified model

Usage
merlin_util_ap_mod(gml, m, i)

Arguments
gml  
merlin object - should not be edited
m  
specifies the merlin submodel
i  
index for which ancillary parameter to extract

Author(s)
Michael J. Crowther

References
Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.
merlin_util_depvar - returns the response variable(s)

Description

Utility function to extract the dependent variable(s) for the current model. If the model is a survival/time-to-event model, then it will contain the event times in the first column and the event indicator in the second.

Usage

merlin_util_depvar(gml)

Arguments

gml

merlin object - should not be edited

Author(s)

Emma C. Martin, Alessandro Gasparini and Michael J. Crowther

References


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

merlin_util_ev - returns the observation-level expected value of the outcome

Description

Utility function to extract the expected value of the outcome at the current parameter estimates for a particular model.

Usage

merlin_util_ev(gml, t = NULL)
Arguments
gml merlin object - should not be edited
t specifies the variable which represents time

Author(s)
Michael J. Crowther

References
Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

merlin_util_ev_deriv - returns the first derivative with respect to time of the observation-level expected value of the outcome

Description
Utility function to extract \( \frac{d}{dt} \) of the expected value of the outcome at the current parameter estimates for a particular model.

Usage
merlin_util_ev_deriv(gml, t = NULL)

Arguments
gml merlin object - should not be edited
t specifies the variable which represents time

Author(s)
Michael J. Crowther

References
Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.
Examples

```r
library(merlin)
data(pbc.merlin, package = "merlin")

# Linear fixed-effects model
merlin(model = list(logb ~ year),
       family = "gaussian",
       data = pbc.merlin)
```

```
merlin_util_ev_deriv2  merlin_util_ev_deriv2 - returns the second derivative with respect to time of the observation-level expected value of the outcome
```

Description

merlin_util_ev_deriv2 - returns the second derivative with respect to time of the observation-level expected value of the outcome

Usage

```
merlin_util_ev_deriv2(gml, t = NULL)
```

Arguments

- **gml**: merlin object - should not be edited
- **t**: specifies the variable which represents time

Author(s)

Michael J. Crowther

References


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.
merlin_util_ev_deriv2_mod

*merlin_util_ev_deriv2_mod* - returns the second derivative with respect to time of the observation-level expected value of the specified outcome

**Description**

merlin_util_ev_deriv2_mod - returns the second derivative with respect to time of the observation-level expected value of the specified outcome

**Usage**

merlin_util_ev_deriv2_mod(gml, m, t = NULL)

**Arguments**

- **gml**
  - merlin object - should not be edited
- **m**
  - specifies the merlin submodel
- **t**
  - specifies the variable which represents time

**Author(s)**

Michael J. Crowther

**References**


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

merlin_util_ev_deriv - returns the first derivative with respect to time of the observation-level expected value of the specified outcome

**Description**

Utility function to extract \( \frac{d}{dt} \) of the expected value of the outcome at the current parameter estimates for a specified model.
`merlin_util_ev_integ` - returns the integral with respect to time of the observation-level expected value of the outcome

**Usage**

```r
merlin_util_ev_integ(gml, t = NULL)
```

**Arguments**

- `gml` : merlin object - should not be edited
- `m` : specifies the merlin submodel
- `t` : specifies the variable which represents time

**Author(s)**

Michael J. Crowther

**References**


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

---

**Description**

`merlin_util_ev_integ` - returns the integral with respect to time of the observation-level expected value of the outcome

**Usage**

```r
merlin_util_ev_integ(gml, t = NULL)
```

**Arguments**

- `gml` : merlin object - should not be edited
- `t` : specifies the variable which represents time

**Author(s)**

Michael J. Crowther
References


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

Description

merlin_util_ev_integ_mod - returns the integral with respect to time of the observation-level expected value of the specified outcome

Usage

merlin_util_ev_integ_mod(gml, m, t = NULL)

Arguments

gml merlin object - should not be edited
m specifies the merlin submodel
t specifies the variable which represents time

Author(s)

Michael J. Crowther

References


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.
### merlin_util_ev_mod

**Description**

Utility function to extract the expected value of the outcome at the current parameter estimates for a specified model.

**Usage**

```r
merlin_util_ev_mod(gml, m, t = NULL)
```

**Arguments**

- `gml` merlin object - should not be edited
- `m` specifies the model
- `t` specifies the variable which represents time

**Author(s)**

Michael J. Crowther

**References**


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

### merlin_util_timevar

**Description**

Utility function to extract the time variable(s) for the current model.

**Usage**

```r
merlin_util_timevar(gml)
```
\textit{merlin_util_xzb}

**Arguments**

- \texttt{gml} merlin object - should not be edited

**Author(s)**

Michael J. Crowther

**References**

Crowther MJ. Extended multivariate generalised linear and non-linear mixed effects models. \url{https://arxiv.org/abs/1710.02223}

Crowther MJ. merlin - a unified framework for data analysis and methods development in Stata. \url{https://arxiv.org/abs/1806.01615}

Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

---

\textit{merlin_util_xzb} \textit{- returns the observation-level complex predictor}

**Description**

Utility function to extract the complex predictor evaluated at the current parameter estimates for a particular model.

**Usage**

\texttt{merlin_util_xzb(gml, t = NULL)}

**Arguments**

- \texttt{gml} merlin object - should not be edited
- \texttt{t} specifies the variable which represents time

**Author(s)**

Emma C. Martin, Alessandro Gasparini and Michael J. Crowther

**References**

Crowther MJ. Extended multivariate generalised linear and non-linear mixed effects models. \url{https://arxiv.org/abs/1710.02223}

Crowther MJ. merlin - a unified framework for data analysis and methods development in Stata. \url{https://arxiv.org/abs/1806.01615}

Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.
Examples

```r
library(merlin)
data(pbc.merlin, package = "merlin")

# Linear fixed-effects model
merlin(model = list(logb ~ year),
       family = "gaussian",
       data = pbc.merlin)
```

**merlin_util_xzb_deriv**  
*merlin_util_xzb_deriv* - returns the first derivative with respect to time of the observation-level complex predictor

Description

Utility function to extract d/dt of the complex predictor evaluated at the current parameter estimates for a particular model.

Usage

```r
merlin_util_xzb_deriv(gml, t = NULL)
```

Arguments

- `gml`  
  merlin object - should not be edited
- `t`  
  specifies the variable which represents time

Author(s)

Michael J. Crowther

References

Crowther MJ. Extended multivariate generalised linear and non-linear mixed effects models.  

Crowther MJ. merlin - a unified framework for data analysis and methods development in Stata.  

Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

Examples

```r
library(merlin)
data(pbc.merlin, package = "merlin")

# Linear fixed-effects model
merlin(model = list(logb ~ year),
       family = "gaussian",
       data = pbc.merlin)
```
merlin_util_xzb_deriv2 - returns the second derivative with respect to time of the observation-level complex predictor

Description

merlin_util_xzb_deriv2 - returns the second derivative with respect to time of the observation-level complex predictor

Usage

merlin_util_xzb_deriv2(gml, t = NULL)

Arguments

gml: merlin object - should not be edited

t: specifies the variable which represents time

Author(s)

Michael J. Crowther

References


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

merlin_util_xzb_deriv2_mod - returns the second derivative with respect to time of the observation-level complex predictor of the specified model

Description

merlin_util_xzb_deriv2_mod - returns the second derivative with respect to time of the observation-level complex predictor of the specified model
Usage

merlin_util_xzb_deriv_mod(gml, m, t = NULL)

Arguments

gml  merlin object - should not be edited
m    specifies the merlin submodel
t    specifies the variable which represents time

Author(s)

Michael J. Crowther

References

Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

Description

merlin_util_xzb_deriv_mod - returns the first derivative with respect to time of the observation-level complex predictor of a specified model

Usage

merlin_util_xzb_deriv_mod(gml, m, t = NULL)

Arguments

gml  merlin object - should not be edited
m    specifies the merlin submodel
t    specifies the variable which represents time

Author(s)

Michael J. Crowther
merlin_util_xzb_integ

References


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

merlin_util_xzb_integ - returns the integral with respect to time of the observation-level complex predictor

Description

merlin_util_xzb_integ - returns the integral with respect to time of the observation-level complex predictor

Usage

merlin_util_xzb_integ(gml, t = NULL)

Arguments

  gml merlin object - should not be edited
  t specifies the variable which represents time

Author(s)

Michael J. Crowther

References


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.
merlin_util_xzb_integ_mod

\textit{merlin_util_xzb_integ_mod} - returns the integral with respect to time of the observation-level complex predictor of the specified model

Description

\textit{merlin_util_xzb_integ_mod} - returns the integral with respect to time of the observation-level complex predictor of the specified model

Usage

\texttt{merlin\_util\_xzb\_integ\_mod(gml, m, t = NULL)}

Arguments

- \texttt{gml}: merlin object - should not be edited
- \texttt{m}: specifies the merlin submodel
- \texttt{t}: specifies the variable which represents time

Author(s)

Michael J. Crowther

References

Crowther MJ. Extended multivariate generalised linear and non-linear mixed effects models. \url{https://arxiv.org/abs/1710.02223}

Crowther MJ. merlin - a unified framework for data analysis and methods development in Stata. \url{https://arxiv.org/abs/1806.01615}

Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

merlin_util_xzb_mod

\textit{merlin_util_xzb_mod} - returns the observation-level complex predictor of the specified model

Description

Utility function to extract the complex predictor evaluated at the current parameter estimates for a particular model.

Usage

\texttt{merlin\_util\_xzb\_mod(gml, m, t = NULL)}
mlrcs

Arguments

- `gml` merlin object - should not be edited
- `m` specifies the merlin submodel
- `t` specifies the variable which represents time

Author(s)

Michael J. Crowther

References


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear and non-linear models.

mlrcs_fit multi-level restricted cubic spline model

Description

Fit multi-level restricted cubic spline model

Usage

```r
mlrcs(formula, random = NULL, data, ...)
```

Arguments

- `formula` A model formula for the fixed-effects in the model. Must include one restricted cubic spline term, specified as `rcs(variable,df = #)`.
- `random` A formula for the random-effects in the model. Random-effects should be specified as a one-sided formula, e.g. `~ 1 + trt | id` for random effect on the intercept and treatment at the `id` level. Random-effects can be estimated at any number of nested random-effect levels by providing a list of one-sided formulas. When specifying random-effect at multiple levels. The one-sided formula should be given in order, starting with the highest level. Only required when `rcs = TRUE`.
- `data` A data frame containing all variables required for fitting the model.
- `...` Further arguments passed to `merlin`.

Value

An object of class `mlrcs`.
mlsurv

Fit proportional hazards survival models

Description
Fit proportional hazards survival models

Usage
mlsurv(
  formula,
  distribution,
  df = NULL,
  powers = NULL,
  rcs = TRUE,
  data,
  from.null = NULL,
  ...
)

Arguments

<table>
<thead>
<tr>
<th>Argument</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>formula</td>
<td>A model formula, where the left-hand side is a Surv object.</td>
</tr>
<tr>
<td>distribution</td>
<td>A parametric distribution for the baseline hazard. Possible values are</td>
</tr>
<tr>
<td></td>
<td>exponential, weibull, gompertz, rp, logchazard, and loghazard. rp is</td>
</tr>
<tr>
<td></td>
<td>equivalent to a logchazard model with restricted cubic splines (argument</td>
</tr>
<tr>
<td></td>
<td>rcs = TRUE).</td>
</tr>
</tbody>
</table>
df Represents the number of degrees of freedom used for the restricted cubic splines when flexibly modelling the baseline hazard. Only required when rcs = TRUE.

powers A vector representing the degree of the fractional polynomials used to model the baseline hazard (with a maximum degree of 2). Only required when rcs = FALSE.

rcs Use restricted cubic splines when flexibly modelling the baseline hazard? Defaults to TRUE, and the alternative is using fractional polynomials.

data A data frame containing all variables required for fitting the model. Can be a tibble object.

from.null A vector of starting values for the null model (used to get improved starting values). This is mostly useful when experiencing issues with default starting values or convergence issues.

... Further arguments passed to merlin.

Value
An object of class mlsurv.

Examples
# Weibull model
library(survival)
data("pbc.merlin", package = "merlin")
fit <- mlsurv(
  formula = Surv(stime, died) ~ trt,
  distribution = "weibull",
  data = pbc.merlin
)
summary(fit)

# Royston-Parmar model with 3 degrees of freedom
fit <- mlsurv(
  formula = Surv(stime, died) ~ trt,
  distribution = "rp",
  df = 3,
  data = pbc.merlin
)
summary(fit)

## Not run:
# Flexible parametric model on the log-hazard scale with fractional polynomials
fit <- mlsurv(
  formula = Surv(stime, died) ~ trt,
  distribution = "loghazard",
  powers = c(0, 1),
  rcs = FALSE,
  data = pbc.merlin
)
summary(fit)
Mayo Clinic primary biliary cirrhosis data

Description

This data is from the Mayo Clinic trial in primary biliary cirrhosis (PBC) of the liver conducted between 1974 and 1984. A total of 424 PBC patients, referred to Mayo Clinic during that ten-year interval met eligibility criteria for the randomized placebo controlled trial of the drug D-penicillamine, but only the first 312 cases in the data set participated in the randomized trial. Therefore, the data here are for the 312 patients with largely complete data.

Usage

data(pbc)

data(pbc.merlin)

Format

A data frame with 1945 observations on the following 20 variables:

id patients identifier; in total there are 312 patients.
years number of years between registration and the earlier of death, transplantation, or study analysis time.
status a factor with levels alive, transplanted and dead.
drug a factor with levels placebo and D-penicil.
age at registration in years.
sex a factor with levels male and female.
year number of years between enrollment and this visit date, remaining values on the line of data refer to this visit.
ascites a factor with levels No and Yes.
hepatomegaly a factor with levels No and Yes.
spiders a factor with levels No and Yes.
edema a factor with levels No edema (i.e. no edema and no diuretic therapy for edema), edema no diuretics (i.e. edema present without diuretics, or edema resolved by diuretics), and edema despite diuretics (i.e. edema despite diuretic therapy).
serBilir serum bilirubin in mg/dl.
serChol serum cholesterol in mg/dl.
albumin albumin in mg/dl.
alkaline alkaline phosphatase in U/liter.
SGOT SGOT in U/ml.
platelets platelets per cubic ml/1000.
prothrombin prothrombin time in seconds.
histologic histologic stage of disease.
status2 a numeric vector with the value 1 denoting if the patient was dead, and 0 if the patient was alive or transplanted.

An object of class data.frame with 1945 rows and 25 columns.

Note

pbc.merlin is a version of the pbc dataset in merlin format.

Source

pbc.

References


Description

predictions following the fit of a merlin model

Usage

## S3 method for class 'merlin'
predict(
  object,
  stat = "eta",
  type = "fixedonly",
  predmodel = 1,
  causes = NULL,
  at = NULL,
  contrast = NULL,
  ...
)
predict.merlin

Arguments

object merlin model object
stat specifies which prediction, which can be one of:
  • eta the expected value of the complex predictor
  • mu the expected value of the response variable
  • hazard the hazard function
  • chazard the cumulative hazard function
  • logchazard the log cumulative hazard function
  • survival the survival function
  • cif the cumulative incidence function
  • rmst calculates the restricted mean survival time, which is the integral of
    the survival function within the interval \((0,t]\), where \(t\) is the time at which
    predictions are made. If multiple survival models have been specified in
    your merlin model, then it will assume all of them are cause-specific competing
    risks models, and include them in the calculation. If this is not the case, you can override which models are included by using the causes option. \(\text{rmst} = t - \text{totaltimelost}\).
  • timelost calculates the time lost due to a particular event occurring, within
    the interval \((0,t]\). In a single event survival model, this is the integral of the
    cif between \((0,t]\). If multiple survival models are specified in the merlin
    model then by default all are assumed to be cause-specific event time models
    contributing to the calculation. This can be overridden using the causes option.
  • totaltimelost total time lost due to all competing events, within \((0,t]\). If
    multiple survival models are specified in the merlin model then by default all are assumed to be cause-specific event time models contributing to the calculation. This can be overridden using the causes option. \(\text{totaltimelost}\) is the sum of the timelost due to all causes.
  • cifdifference calculates the difference in cif predictions between values
    of a covariate specified using the contrast option.
  • hdifference calculates the difference in hazard predictions between values
    of a covariate specified using the contrast option.
  • rmtdifference calculates the difference in rmst predictions between values
    of a covariate specified using the contrast option.
  • mudifference calculates the difference in mu predictions between values
    of a covariate specified using the contrast option.
  • etadifference calculates the difference in eta predictions between values
    of a covariate specified using the contrast option.
type the type of prediction, either:
  • fixedonly prediction calculated based only on the fixed effects; the default.
  • marginal prediction calculated marginally with respect to the latent variables. the stat is calculated by integrating the prediction function with respect to all the latent variables over their entire support.
predict.merlin

predmodel specifies which model to obtain predictions from; default is predmodel=1
causes is for use when calculating predictions from a competing risks merlin model. By default, cif, rmst, timelost and totaltimelost assume that all survival models included in the merlin model are cause-specific hazard models contributing to the calculation. If this is not the case, then you can specify which models (indexed using the order they appear in your merlin model by using the causes option, e.g. causes=c(1,2).
at specify covariate values for prediction. Fixed values of covariates should be specified in a list e.g. at = c("trt" = 1, "age" = 50).
contrast specifies the values of a covariate to be used when comparing statistics, such as when using the cifdifference option to compare cumulative incidence functions, e.g. contrast = c("trt" = 0,"trt" = 1).
...
other options

Author(s)

Emma C. Martin, Alessandro Gasparini and Michael J. Crowther

References


Martin EC, Gasparini A, Crowther MJ. merlin - an R package for mixed effects regression of linear, non-linear and user-defined models.

See Also

merlin

Examples

library(merlin)
data(pbc.merlin, package = "merlin")

# Linear fixed-effects model
mod <- merlin(model = list(logb ~ year),
              family = "gaussian",
              data = pbc.merlin)
predict(mod, stat="eta", type="fixedonly")
print.mlrcs  

Description

Print the coefficients from a merlin fit.

Usage

```r
## S3 method for class 'merlin'
print(x, digits = max(3L, getOption("digits") - 3L), ...)
```

Arguments

- `x`: An object of class merlin.
- `digits`: The number of significant digits to use when printing.
- `...`: Not used.

print.mlrcs  

Description

Print the coefficients from a mlrcs fit.

Usage

```r
## S3 method for class 'mlrcs'
print(x, digits = max(3L, getOption("digits") - 3L), simplify = TRUE, ...)
```

Arguments

- `x`: An object of class mlrcs.
- `digits`: The number of significant digits to use when printing.
- `simplify`: Should non-interprettable coefficients be hidden (e.g. splines and flexible polynomials terms)? Defaults to TRUE.
- `...`: Not used.
print.mlsurv  

Print mlsurv Fits

Description

Print the coefficients from a mlsurv fit.

Usage

```r
## S3 method for class 'mlsurv'
print(x, digits = max(3L,getOption("digits") - 3L), simplify = TRUE, ...)
```

Arguments

- `x`: An object of class `mlsurv`.
- `digits`: The number of significant digits to use when printing.
- `simplify`: Should non-interpretable coefficients be hidden (e.g. splines and flexible polynomials terms)? Defaults to TRUE.
- `...`: Not used.

sim3  

Simulated 3-level survival data

Description

Simulated 3-level survival data

Usage

```r
data(sim3)
```

Format

A data frame...
Summary of merlin Fits

**Description**
These functions are all methods for class merlin or summary.merlin objects.

**Usage**

```r
## S3 method for class 'merlin'
summary(object, sig = 0.95, ...)

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

**Arguments**
- **object**: An object of class merlin
- **sig**: Significancy level for confidence intervals. Defaults to 0.95.
- **...**: Not used.
- **x**: An object of class summary.merlin
- **digits**: The number of significant digits to use when printing.

Summary of mlrcs Fits

**Description**
These functions are all methods for class mlrcs or summary.mlrcs objects.

**Usage**

```r
## S3 method for class 'mlrcs'
summary(object, sig = 0.95, ...)

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

**Arguments**
- **object**: An object of class mlrcs
- **sig**: Significancy level for confidence intervals. Defaults to 0.95.
- **...**: Not used.
- **x**: An object of class summary.mlrcs
- **digits**: The number of significant digits to use when printing.
### summary.mlsurv

**Summarizing mlsurv Fits**

#### Description
These functions are all methods for class `mlsurv` or `summary.mlsurv` objects.

#### Usage

```r
# S3 method for class 'mlsurv'
summary(object, sig = 0.95, ...)

# S3 method for class 'summary.mlsurv'
print(x, digits = \max(3, getOption("digits") - 3), simplify = TRUE, ...)
```

#### Arguments
- `object`: An object of class `mlsurv`
- `sig`: Significance level for confidence intervals. Defaults to 0.95.
- `...`: Not used.
- `x`: An object of class `summary.mlsurv`
- `digits`: The number of significant digits to use when printing.
- `simplify`: Should non-interpretatable coefficients be hidden (e.g. splines and flexible polynomials terms)? Defaults to TRUE.

### vcov.merlin

**Calculate Variance-Covariance Matrix for a merlin Model Object**

#### Description
Returns the variance-covariance matrix of all estimated parameters of a fitted `merlin` model.

#### Usage

```r
# S3 method for class 'merlin'
vcov(object, ...)

# S3 method for class 'summary.merlin'
vcov(object, ...)
```

#### Arguments
- `object`: An object of class `merlin` or `summary.merlin`.
- `...`: Not used.
vcov.mlrcs

Calculate Variance-Covariance Matrix for a mlrcs Model Object

Description

Returns the variance-covariance matrix of all estimated parameters of a fitted mlrcs model.

Usage

```r
## S3 method for class 'mlrcs'
vcov(object, ...)
```

```r
## S3 method for class 'summary.mlrcs'
vcov(object, ...)
```

Arguments

- `object`: An object of class mlrcs or summary.mlrcs.
- `...`: Not used.

vcov.mlsurv

Calculate Variance-Covariance Matrix for a mlsurv Model Object

Description

Returns the variance-covariance matrix of all estimated parameters of a fitted mlsurv model.

Usage

```r
## S3 method for class 'mlsurv'
vcov(object, ...)
```

```r
## S3 method for class 'summary.mlsurv'
vcov(object, ...)
```

Arguments

- `object`: An object of class mlsurv or summary.mlsurv.
- `...`: Not used.
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