

# Package ‘SurvMI’

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**Type** Package

**Title** Multiple Imputation Method in Survival Analysis

**Version** 0.1.0

**Depends** R(>= 3.4.0)

**Imports** survival (>= 3.1.11), zoo, stats, graphics, base

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**Description** In clinical trials, endpoints are sometimes evaluated with uncertainty. Adjudication is commonly adopted to ensure the study integrity. We propose to use multiple imputation (MI) introduced by Rubin (1987) <doi:10.1002/9780470316696> to incorporate these uncertainties if reasonable event probabilities were provided. The method has been applied to Cox Proportional Hazard (PH) model, Kaplan-Meier (KM) estimation and Log-rank test in this package. Moreover, weighted estimations discussed in Cook (2004) <doi:10.1016/S0197-2456(00)00053-2> were also implemented with weights calculated from event probabilities. In conclusion, this package can handle time-to-event analysis if events presented with uncertainty by different methods.

**License** GPL-2

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**LazyData** TRUE

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**NeedsCompilation** no

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CoxMI	<i>Cox PH model with MI method</i>
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## Description

CoxMI function estimated Cox model with uncertain endpoints by using MI method. Users have to provide survival data in a long format with rows for all potential events, together with corresponding event probabilities. The long format data should be transformed by the `uc_data_transform` function into a data list before feed into the function.

## Usage

```
CoxMI(data_list, nMI=1000, covariates=NULL, id=NULL, ...)
```

## Arguments

<code>data_list</code>	The data list which has been transformed from the long format by the <code>uc_data_transform</code> function.
<code>nMI</code>	Number of imputations (>1).
<code>covariates</code>	Vector of covariates on the RHS of Cox model. Categorical variables need to be encoded as factor variables before entering the model. This encoding has to be done before the data transform step.
<code>id</code>	Vector of id variable if Andersen-Gill model is required.
<code>...</code>	Other arguments passed on to <code>coxph()</code> .

## Details

Calculates the estimated parameters as in the usual Cox proportional hazards model when event uncertainties present. The data are assumed to consist of potential event times with probabilities or weights between 0 and 1 corresponding to the probability that an event occurred at each time.

## Value

<code>est</code>	Estimated vector of coefficients in the model
<code>var</code>	Estimated variance of the coefficients
<code>betamat</code>	Matrix containing estimate of coefficient from each imputed dataset
<code>Var_mat</code>	Array containing variances for each imputed dataset
<code>Between Var</code>	Between imputation variance

Within Var	Mean within imputed dataset variance
nMI	Number of imputed datasets
pvalue	Estimated two-sided p-value
en	Expected events count - mean event count of imputed datasets

**Author(s)**

Yiming Chen, John Lawrence

**References**

[1] Rubin DB. Multiple Imputation for Nonresponse in Surveys. New York: Wiley; 1987

**See Also**

[Coxwt](#), [CoxMI.summ](#).

**Examples**

```
set.seed(128)
df_x<-data_sim(n=500,true_hr=0.8,haz_c=0.5/365)
df_x$f.trt<-as.factor(df_x$trt_long)
data_intrim<-uc_data_transform(data=df_x,
                               var_list=c("id_long","f.trt"),
                               var_list_new=c("id","trt"),
                               time="time_long",
                               prob="prob_long")
#nMI=10 used in the example below to reduce the time needed
#but a large number as nMI=1000 is recommended in practice

fit<-CoxMI(data_list=data_intrim,nMI=10,covariates=c("trt"))
CoxMI.summ(fit)

fit<-CoxMI(data_list=data_intrim,nMI=1000,covariates=c("trt"),id=c("id"))
CoxMI.summ(fit)
```

---

CoxMI.summ

*Summary function for the Cox MI model*

---

**Description**

Prints the fitting results from the CoxMI function.

**Usage**

```
CoxMI.summ(x,digits=3)
```

**Arguments**

<code>x</code>	An object returned by the <code>CoxMI</code> function.
<code>digits</code>	Digits of output

**Details**

Print a summary table of Cox regression result with MI implemented.

**Value**

A summary table of Cox regression result with MI implemented.

**Author(s)**

Yiming Chen

**See Also**

[CoxMI](#).

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Coxwt

*Weighted Cox PH model estimation*

---

**Description**

Estimate the Cox PH model by weighted partial likelihood. Event weights are calculated with respect to event probabilities.

**Usage**

```
Coxwt(data_list, covariates, init=NULL, BS=FALSE, nBS=1000)
```

**Arguments**

<code>data_list</code>	The data list which has been transformed from the long format by the <code>uc_data_transform</code> function.
<code>covariates</code>	The vector of variable on the RHS of the Cox model.
<code>init</code>	The initial value of covariates vector in the likelihood, length matches the length of covariates.
<code>BS</code>	T/F, whether conduct estimation via the Bootstrap method.
<code>nBS</code>	Number of BS, only effective if <code>BS=TRUE</code> .

**Value**

coefficients	Estimated vector of coefficients in the model
var	Estimated variance of the coefficients
hr	Estimated hazard ratios in the model
z	Wald test statistics
pvalue	Estimated two-sided p-value
coefficients_bs	Bootstrapped coefficient estimation
var_bs	Bootstrapped variance estimation
column_name	Column name

**Author(s)**

Yiming Chen, John Lawrence

**References**

- [1]Cook TD. Adjusting survival analysis for the presence of unadjudicated study events. *Controlled clinical trials*. 2000;21(3):208-222.
- [2]Cook TD, Kosorok MR. Analysis of time-to-event data with incomplete event adjudication. *Journal of the american statistical association*. 2004;99(468):1140-1152.
- [3]Snapinn SM. Survival analysis with uncertain endpoints. *Biometrics*. 1998;54(1):209-218.

**See Also**

[CoxMI](#), [Coxwt.summ](#).

**Examples**

```
df_x<-data_sim(n=500,0.8,haz_c=0.5/365)
data_intrim<-uc_data_transform(data=df_x,
                               var_list=c("id_long","trt_long"),
                               var_list_new=c("id","trt"),
                               time="time_long",
                               prob="prob_long")
fit<-Coxwt(data_list=data_intrim,covariates=c("trt"),init=c(1),BS=FALSE)
Coxwt.summ(fit)

##an example if we would like to check the BS variance

fit2<-Coxwt(data_list=data_intrim,covariates=c("trt"),init=c(1),BS=TRUE, nBS = 100)
Coxwt.summ(fit2)
```

---

`Coxwt.summ`*Summary function for the weighted Cox model*

---

**Description**

Print the fitting results from the weighted Cox regression.

**Usage**

```
Coxwt.summ(x,digits=3)
```

**Arguments**

`x` An object returned by the `Coxwt` function  
`digits` Digits of output

**Value**

A summary table of weighted Cox regression result.

**Author(s)**

Yiming Chen

**See Also**

[Coxwt](#), [CoxMI](#).

---

`data_sim`*Simulated survival data with uncertain endpoints from exponential distribution.*

---

**Description**

`data_sim` function simulates data from a hypothetical 1:1 two-arms clinical trial, with one year uniform accrual period and three years follow-up.

`data_sim2` function simplifies data list generated from above function to a more events only case. Note this function is only used for demonstration purpose.

**Usage**

```
data_sim(n=200,true_hr=0.8,haz_c=1/365)  
data_sim2(data_list,covariates,percentage)
```

**Arguments**

n	Total number of subject.
true_hr	True hazard ratio between trt and control.
haz_c	True event rate in the control arm.
data_list	The data list which has been transformed from the long format by uc_data_transform function.
covariates	The covariate we pose the true HR.
percentage	The percentage of censored subjects with potential events we would like to utilize in the analysis. Ideally, with more potential events added, more power gain of imputation.

**Value**

Dataframe. Simulated datasets with event probabilities and potential event date.

**Author(s)**

Yiming Chen, John Lawrence

**Examples**

```
df_x<-data_sim(n=500,true_hr=0.8,haz_c=1/365)
data_intrim<-uc_data_transform(data=df_x,
                              var_list=c("id_long","trt_long"),
                              var_list_new=c("id","trt"),
                              time="time_long",
                              prob="prob_long")
df_y<-data_sim2(data_list=data_intrim,covariates=c("trt"),percentage=0.2)
```

---

KMMI

*Kaplan-Meier estimation with event uncertainty*

---

**Description**

KM estimation for survival data when event uncertainty presents. KM plot will be output if plot=TRUE specified.

**Usage**

```
KMMI(data_list,nMI,covariates,data_orig = NULL,plot = TRUE,
      time_var=NULL,event_var=NULL)
```

**Arguments**

<code>data_list</code>	The data list which has been transformed from the long format by <code>uc_data_transform</code> function.
<code>nMI</code>	Number of imputations (>1). If missing, weighted statistics would be output instead.
<code>covariates</code>	The grouping variable, no need to be factorized. If missing then the overall KM is returned.
<code>plot</code>	T/F, whether output a KM plot, the plot potentially contains KM curves from original dataset and imputed/weighted dataset.
<code>data_orig</code>	The original data without any uncertain events. If supplies then user can compare results from certain events only and all possible events.
<code>time_var</code>	Time variable in <code>data_orig</code> . If user provides the orig dataset then user need to specify the time and event indicator variable in the original dataset.
<code>event_var</code>	Event indicator variable in the original data set.

**Value**

<code>KM_mi</code>	A dataset contains MI estimation and variance at all potential event time
<code>KM_cook</code>	A dataset contains weighted KM estimation and variance at all potential event time
<code>ngroup</code>	Number of groups
<code>cate_level</code>	Values of the categorical variable
<code>nMI</code>	Number of imputed datasets

**Author(s)**

Yiming Chen

**References**

- [1]Cook TD. Adjusting survival analysis for the presence of unadjudicated study events. *Controlled clinical trials*. 2000;21(3):208-222.
- [2]Cook TD, Kosorok MR. Analysis of time-to-event data with incomplete event adjudication. *Journal of the american statistical association*. 2004;99(468):1140-1152.
- [3]Klein JP, Moeschberger ML. *Survival Analysis : Techniques for Censored and Truncated Data*. New York: Springer; 1997.
- [4]Rubin DB. *Multiple Imputation for Nonresponse in Surveys*. New York: Wiley; 1987

**See Also**

[uc\\_data\\_transform](#)



## Examples

```
##an example with more potential event case
##data_orig was created as keeping the event with largest weights for individuals
df_x<-data_sim(n=500,0.8,haz_c=0.5/365)
data_intrim<-uc_data_transform(data=df_x,
                              var_list=c("id_long","trt_long"),
                              var_list_new=c("id","trt"),
                              time="time_long",
                              prob="prob_long")
df_y<-data_sim2(data_list=data_intrim,covariates=c("trt"),percentage=1)
data_orig<-df_y[df_y$prob==0|df_y$prob==1,]
data_orig<-data_orig[!duplicated(data_orig$id),]
data_orig$cens<-data_orig$prob

##weighted estimation
KM_res<-KMMI(data_list=data_intrim,nMI=NULL,covariates=c("trt"),plot=TRUE,data_orig=NULL)

##MI estimation
KMMI(data_list=data_intrim,nMI=1000,covariates=c("trt"),plot=TRUE,data_orig=NULL)

data_intrim2<-uc_data_transform(data=df_y, var_list=c("id","trt"),
                               var_list_new=NULL,time="time", prob="prob")

KMMI(data_list=data_intrim2,nMI=1000,covariates=c("trt"),plot=TRUE,data_orig=data_orig,
      time_var=c("time"),event_var=c("cens"))
```

---

LRMI

*Log-rank test with events uncertainty*


---

## Description

This function conducts the Log-rank test with respect to uncertain endpoints, by MI or weighted method.

## Usage

```
LRMI(data_list, nMI, covariates, strata = NULL,...)
```

## Arguments

<code>data_list</code>	The data list which has been transformed from the long format by <code>uc_data_transform</code> function.
<code>nMI</code>	Number of imputation (>1). If missing, weighted statistics would be output instead.
<code>covariates</code>	The categorical variable used in the Log-rank test. No need to factorize numeric variables.

strata            Strata variable may required by the Log-rank test  
 ...              Other arguments passed on to survdiff().

### Value

est               Estimated LR statistics, either from the MI method or weighted method  
 var               Estimated variance matrix  
 est\_mat          Matrix containing estimate of statistics from each imputed dataset  
 Var\_mat          Array containing variances for each imputed dataset  
 Between Var     Between imputation variance  
 Within Var      Mean within imputed dataset variance  
 nMI              Number of imputed datasets  
 pvalue          Estimated two-sided Chi-square test p-value  
 df                Degree of freedom  
 covariates      covariates  
 ngroup          Number of groups  
 obsmean         Mean of observed events count across imputations  
 expmean         Mean of expected events count across imputations

### Author(s)

Yiming Chen

### References

- [1]Cook TD. Adjusting survival analysis for the presence of unadjudicated study events. *Controlled clinical trials*. 2000;21(3):208-222.
- [2]Cook TD, Kosorok MR. Analysis of time-to-event data with incomplete event adjudication. *Journal of the american statistical association*. 2004;99(468):1140-1152.
- [3]Klein JP, Moeschberger ML. *Survival Analysis : Techniques for Censored and Truncated Data*. New York: Springer; 1997.
- [4]Rubin DB. *Multiple Imputation for Nonresponse in Surveys*. New York: Wiley; 1987

### See Also

[uc\\_data\\_transform](#), [LRMI.summ](#)

### Examples

```
df_x<-data_sim(n=500,0.8,haz_c=0.5/365)
data_intrim<-uc_data_transform(data=df_x,
                               var_list=c("id_long","trt_long"),
                               var_list_new=c("id","trt"),
                               time="time_long",
                               prob="prob_long")
```

```
#nMI=10 used in the example below to reduce the time needed
#but a large number as nMI=1000 is recommended in practice
fit<-LRMI(data_list=data_intrim,nMI=10,covariates=c("trt"),strata=NULL)
LRMI.summ(fit)
```

---

LRMI.summ

*Prints the test results output by the LRMI function*


---

### Description

Summary function for the Log-rank test either by the MI method or the weighted method.

### Usage

```
LRMI.summ(x,digits=3)
```

### Arguments

x	An object returned by the LRMI function.
digits	Digits of output

### Value

A summary table of LR test result with MI implemented.

### Author(s)

Yiming Chen

### See Also

[LRMI](#)

---

uc\_data\_transform

*Transform long formatted time-to-event data into a data list*


---

### Description

This function transforms data from long format (one record per event) to a datalist with length as unique subject number. The transformation is required before fitting other models from the package.

### Usage

```
uc_data_transform(data,var_list,var_list_new,time,prob)
```

**Arguments**

data	The dataset in long format with a row for each potential event. For censoring record, the event prob should be 0. It should include id, time and prob variables at a minimum. If any covariates are included in the call to the function, then these variables should also be included. A censoring record is required for each subject. Categorical variables need to be encoded as factor variable before transformation if they are expected to be in the Cox model.
var_list	The list of identification variables, such as: c("id_long", "trt_long").
time	The time variable need to be transformed, e.g. time_long.
prob	The prob variable need to be transformed, e.g. prob_long.
var_list_new	The character vector contains the new names for the id variables defined in the var_list, if missing, previous variable names would be used.

**Value**

time	The list of all potential event time
prob	The list of all potential event probabilities
weights	The list of all potential event weights
e	The list of individual potential event count
s	The list of all survival probabilities
data_uc	The dataset contains unique information of each subject
data_long	The dataset contains the original data in long format

**Author(s)**

Yiming Chen

**Examples**

```
df_x<-data_sim(n=1000,true_hr=0.8,haz_c=0.5/365)
df_x$f.trt<-as.factor(df_x$trt_long)
data_intrim<-uc_data_transform(data=df_x,
                               var_list=c("id_long", "f.trt"),
                               var_list_new=c("id", "trt"),
                               time="time_long",
                               prob="prob_long")
```

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