

# Package ‘icdGLM’

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**Type** Package

**Title** EM by the Method of Weights for Incomplete Categorical Data in Generalized Linear Models

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**Description** Provides an estimator for generalized linear models with incomplete data for discrete covariates. The estimation is based on the EM algorithm by the method of weights by Ibrahim (1990) <DOI:10.2307/2290013>.

**License** GPL (>= 2)

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**Imports** stats, Matrix

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 expand\_data

*Complete incomplete data*


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### Description

This function fills all incomplete data with a set of possible values equally weighted. This is done in order to apply *icdglm*.

### Usage

```
expand_data(data, y, missing.x, value.set, weights = rep.int(1, NROW(data)),
            indicator = rep.int(0, NROW(data)))
```

### Arguments

data	a vector, matrix, list or data frame containing numerics. This data is checked for incompleteness and needs to contain the independent variables for a subsequent regression with n observations and k regressors. Each gap is filled with all values from value.set. New observations are added for each possible value.
y	a vector of integers or numerics. This vector has to be complete and is the dependent variable for a subsequent regression.
missing.x	a vector that contains integers and gives the position of the independent variables, for which the data will be checked for incompleteness, i.e. for a matrix the position of the corresponding columns.
value.set	a vector of numerics containing all possible values the missing data can take. This set has to be finite.
weights	a vector of numerics giving the initial weight of each observation. Default is 1 for each observation.
indicator	a vector of integers that indicates which observations belong to each other. If some columns with incomplete data were already completed, this vector has to be passed here. For raw incomplete data, the function connects observations which belong to each other. Default is 0 for this vector indicating no connection.

### Value

expand\_data returns a list with the following elements:

- dataa data frame of the expanded data with all possible observations (independent variables). The dependent variable is included in the last column.
- weightsthe weights for each possible observation.
- indicatora vector which indicates which observations belong to each other. Such observations have the same integer being the indicator.

**Examples**

```
data(TLI.data)
  expand_data(data = TLI.data[,1:3],
            y = TLI.data[,4],
            missing.x = 1:3,
            value.set = 0:1)
```

icdglm

*EM by the Method of Weights for Incomplete Data in GLMs***Description**

This function applies the EM algorithm by the method of weights to incomplete data in a general linearized model.

**Usage**

```
icdglm(formula, family = binomial(link = "logit"), data, weights = rep.int(1, NROW(data)),
       indicator = rep.int(0, NROW(data)), control = list(), model = TRUE)
```

**Arguments**

formula	an object of class "formula" (or one that can be coerced to that class): a symbolic description of the model to be fitted.
family	a description of the error distribution and link function to be used in the model. This can be a character string naming a family function, a family function or the result of a call to a family function. (See <a href="#">family</a> for details of family functions.)
data	an optional data frame, list or environment (or object coercible by <code>as.data.frame</code> to a data frame) containing the variables in the model. If not found in data, the variables are taken from <code>environment(formula)</code>
weights	a vector which attaches a weight to each observation. For incomplete data, this is obtained from <a href="#">expand_data</a> .
indicator	a vector that indicates which observations belong to each other. This is obtained from <a href="#">expand_data</a> .
control	a list of control characteristics used for the iteration process in <i>icdglm.fit</i> . See <a href="#">glm.control</a> for further information how this works. Default settings are: <code>epsilon = 1e-10</code> , <code>maxit = 100</code> , <code>trace = FALSE</code> .
model	a logical value indicating whether model frame should be included as a component of the returned value.

## Value

*icdglm* returns an object of class inheriting from "icdglm.fit", "glm" and "lm". The function [summary.icdglm](#) can be used to obtain a summary of the results. *icdglm* returns a list with the following elements:

- *xa* matrix of numerics containing all independent variables
- *ya* vector of numerics containing the dependent variable
- *new.weights* the new weights obtained in the final iteration of *icdglm.fit*
- *indicator* a vector of integers indicating which observations belong to each other
- *glm.fit.data* typical *glm.fit* output for the last iteration. See [glm.fit](#) for further information.
- *coefficients* a named vector of coefficients
- *qrQR* Decomposition of the information matrix
- *residuals* the residuals of the final iteration
- *fitted.values* the fitted mean values, obtained by transforming the linear predictors by the inverse of the link function.
- *rank* the numeric rank of the fitted linear model
- *family* the [family](#) object used.
- *linear.predictor* the linear fit on link scale
- *deviance* up to a constant, minus twice the maximized log-likelihood. Where sensible, the constant is chosen so that a saturated model has deviance zero.
- *aic* see [glm](#)
- *null.deviance* The deviance for the null model, comparable with deviance. The null model will include the offset, and an intercept if there is one in the model. Note that this will be incorrect if the link function depends on the data other than through the fitted mean: specify a zero offset to force a correct calculation.
- *iter* an integer containing the number of iterations in *icdglm.fit* before convergence
- *weights* the working weights, that is the weights in the final iteration of the IWLS fit.
- *prior.weights* the weights initially supplied, a vector of 1s if none were.
- *df.residual* the residual degrees of freedom from the initial data set
- *df.null* the residual degrees of freedom from initial data set for the null model
- *model* model frame
- *converged* TRUE if *icdglm* converged.
- *call* the match call
- *formula* the formula supplied
- *terms* the [terms](#) object used
- *data* the data argument
- *control* the value of the *control* argument used

## References

Ibrahim, Joseph G. (1990). *Incomplete Data in Generalized Linear Models*. Journal of the American Statistical Association, Vol.85, No. 411, pp. 765 - 769.

**See Also**

[expand\\_data](#), [icdglm.fit](#), [glm](#), [glm.fit](#), [glm.control](#), [summary.glm](#)

**Examples**

```
data(TLI.data)
complete.data <- expand_data(data = TLI.data[,1:3],
                             y = TLI.data[,4],
                             missing.x = 1:3,
                             value.set = 0:1)
example <- icdglm(y ~ x1 + x2 + x3, family = binomial(link = "logit"),
                 data = complete.data$data, weights = complete.data$weights,
                 indicator = complete.data$indicator)
summary(example)
```

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icdglm.fit	<i>EM by the Method of Weights for Incomplete Data in GLMs (Algorithm)</i>
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**Description**

This function applies the EM algorithm by the method of weights to incomplete data in a general linearized model.

**Usage**

```
icdglm.fit(x, y, weights = rep.int(1, NROW(x)), indicator = rep.int(0, NROW(x)),
          family = binomial(link = "logit"), control=list())
```

**Arguments**

x	a vector, matrix, list or data frame containing the independent variables
y	a vector of integers or numerics. This is the dependent variable.
weights	a vector which attaches a weight to each observation. For incomplete data, this is obtained from <a href="#">expand_data</a> .
indicator	a vector that indicates which observations belong to each other. This is obtained from <a href="#">expand_data</a> .
family	family for glm.fit. See <a href="#">glm</a> or <a href="#">family</a> for more details. Default is binomial(link = "logit").
control	a list of control characteristics. See <a href="#">glm.control</a> for further information. Default settings are: epsilon = 1e-10, maxit = 100, trace = FALSE.

**Value**

`icdglm.fit` returns a list with the following elements:

- `xa` matrix of numerics containing all independent variables
- `ya` vector of numerics containing the dependent variable
- `new.weights` the new weights obtained in the final iteration of *icdglm.fit*
- `indicator` a vector of integers indicating which observations belong to each other
- `glm.fit.data` typical `glm.fit` output for the last iteration. See [glm.fit](#) for further information.
- `coefficients` a named vector of coefficients
- `qrQR` Decomposition of the information matrix
- `residuals` the residuals of the final iteration
- `fitted.values` the fitted mean values, obtained by transforming the linear predictors by the inverse of the link function.
- `rank` the numeric rank of the fitted linear model
- `family` the [family](#) object used.
- `linear.predictors` the linear fit on link scale
- `deviance` up to a constant, minus twice the maximized log-likelihood. Where sensible, the constant is chosen so that a saturated model has deviance zero.
- `aic` see [glm](#)
- `null.deviance` The deviance for the null model, comparable with deviance. The null model will include the offset, and an intercept if there is one in the model. Note that this will be incorrect if the link function depends on the data other than through the fitted mean: specify a zero offset to force a correct calculation.
- `iter` an integer containing the number of iterations in *icdglm.fit* before convergence
- `weights` the working weights, that is the weights in the final iteration of the IWLS fit.
- `prior.weights` the weights initially supplied, a vector of 1s if none were.
- `df.residual` the residual degrees of freedom from the initial data set
- `df.null` the residual degrees of freedom from initial data set for the null model
- `model` model frame
- `converged` TRUE if *icdglm* converged.
- `call` the match call
- `formula` the formula supplied
- `terms` the [terms](#) object used
- `data` the data argument
- `control` the value of the *control* argument used

**References**

Ibrahim, Joseph G. (1990). *Incomplete Data in Generalized Linear Models*. Journal of the American Statistical Association, Vol.85, No. 411, pp. 765 - 769.

**See Also**

[expand\\_data](#), [icdglm.glm.fit](#), [glm.control](#), [summary.glm](#)

**Examples**

```
data(TLI.data)
complete.data <- expand_data(data = TLI.data[, 1:3],
                             y = TLI.data[, 4],
                             missing.x = 1:3,
                             value.set = 0:1)
example1 <- icdglm.fit(x = complete.data$data[, 1:3],
                      y = complete.data$data[, 4],
                      weights = complete.data$weights,
                      indicator = complete.data$indicator,
                      family = binomial(link = "logit"),
                      control = list(epsilon = 1e-10,
                                     maxit = 100, trace = TRUE))
```

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Leukemia.data

*Survival Times of 33 Leukemia Patients*

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**Description**

This data set is taken from Ibrahim, Joseph G. (1990). *Incomplete Data in Generalized Linear Models*. Journal of the American Statistical Association, Vol.85, No. 411, pp. 765 - 769. The original source is Feigl, P., and Zelen, M. (1965), *Estimation of Exponential Survival Probabilities With Concomitant Information*, Biometrics, 21, pp. 826-838.

**Usage**

```
data(Leukemia.data)
```

**Format**

A data frame with 33 observations on the following 3 variables.

x1 a numeric vector (covariate)

x2 a numeric vector (covariate)

y a numeric vector (the dependent variable)

**Source**

Feigl, P., and Zelen, M. (1965), *Estimation of Exponential Survival Probabilities With Concomitant Information*, Biometrics, 21, pp. 826-838. Ibrahim, Joseph G. (1990). *Incomplete Data in Generalized Linear Models*. Journal of the American Statistical Association, Vol.85, No. 411, pp. 765 - 769.

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summary.icdglm	<i>Summarizing Output of an EM Algorithm by the Method of Weights Using GLMs</i>
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### Description

This function gives a summary of the output of *icdglm*. *summary.icdglm* inherits from *summary.glm*.

### Usage

```
## S3 method for class 'icdglm'
summary(object, dispersion = NULL, correlation = FALSE, symbolic.cor = FALSE, ...)
```

### Arguments

object	an object of class "icdglm", usually, a result of a call to <i>icdglm</i> .
dispersion	the dispersion parameter for the family used. Either a single numerical value or NULL (the default), when it is inferred from object (see details of <i>summary.glm</i> ).
correlation	logical, if TRUE, the correlation matrix of the estimated parameters is returned and printed.
symbolic.cor	logical, if TRUE, print the correlations in a symbolic form (see <i>symnum</i> ) rather than as numbers.
...	further arguments passed to or from other methods.

### Value

*summary.icdglm* returns an object of class "summary.icdglm", a list with components:

- callfunction call of *object*
- termsthe *terms* object used.
- familythe component from *object*
- deviancethe component from *object*
- aicthe component from *object*
- df.residualthe residual degrees of freedom of the initial data set
- null.deviancethe component from *object*
- df.nullthe residual degrees of freedom for the null model.
- iterthe number of iterations in *icdglm.fit*, component from *object*
- deviance.residthe deviance residuals: see *residuals.glm*
- coefficientsthe matrix of coefficients, (corrected) standard errors, t-values and p-values.
- aliasednamed logical vector showing if the original coefficients are aliased.
- dispersioneither the supplied argument or the inferred/estimated dispersion if the latter is NULL.



- dfa 3-vector of the rank of the model and the number of residual degrees of freedom, plus number of coefficients (including aliased ones).
- cov.unscaled the unscaled (dispersion = 1) estimated covariance matrix of the estimated coefficients.
- cov.scaled ditto, scaled by dispersion
- correlation (only if *correlation* is *TRUE*) The estimated correlations of the estimated coefficients.
- symbolic.cor (only if *correlation* is *TRUE*) The value of the argument symbolic.cor.

**Note**

The description of this function is taken from [summary.glm](#) apart from a few differences.

**See Also**

[icdglm](#), [summary.glm](#), [summary](#), [glm](#)

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TLI.data

*TLI Study of 82 Patients*

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**Description**

This data set is taken from Ibrahim, Joseph G. (1990). *Incomplete Data in Generalized Linear Models*. Journal of the American Statistical Association, Vol.85, No. 411, pp. 765 - 769. The original source is Colice, G. L., Stukel, T. A., and Dain, B. (1989), *Laryngeal Complications of Prolonged Intubation*, Chest, No. 96, pp. 877-884.

**Usage**

```
data(TLI.data)
```

**Format**

A data frame with 82 observations on the following 4 variables (3 independent variables and 1 dependent variable).

x1 a numeric vector

x2 a numeric vector

x3 a numeric vector

y a numeric vector (the dependent variable)

**Source**

Colice, G. L., Stukel, T. A., and Dain, B. (1989), *Laryngeal Complications of Prolonged Intubation*, Chest, No. 96, pp. 877-884. Ibrahim, Joseph G. (1990). *Incomplete Data in Generalized Linear Models*. Journal of the American Statistical Association, Vol.85,

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