## **Package 'chantrics'**

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Type Package

Title Loglikelihood Adjustments for Econometric Models

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**Description** Adjusts the loglikelihood of common econometric models for clustered data based on the estimation process suggested in Chandler and Bate (2007) <doi:10.1093/biomet/asm015>, using the 'chandwich' package <https://cran.r-project.org/package=chandwich>, and provides convenience functions for inference on the adjusted models.

**Imports** AER, chandwich, graphics, sandwich, stats, utils, methods, lmtest, rlang, progress, purrr

**Depends** R (>= 4.0.0)

URL https://chantrics.theobruckbauer.eu,

https://github.com/tbruckbauer/chantrics

BugReports https://github.com/tbruckbauer/chantrics/issues

**License** EUPL (>= 1.2)

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## **R** topics documented:

adj_loglik	
alrtest	
anova.chantrics	
chantrics	
glm	
logLik_vec	
predict.chantrics	
residuals.chantrics	
update.chantrics	
	13

## Index

adj\_loglik

Loglikelihood adjustments for fitted models

## Description

This function adjusts the loglikelihood of fitted model objects based on Chandler and Bate (2007). It is a generic function for different types of models, which are listed in **Supported models**. This section also contains links to function-specific help pages.

## Usage

adj\_loglik(x, cluster = NULL, use\_vcov = TRUE, use\_mle = TRUE, ...)

#### Arguments

х	A supported fitted model object, see Supported models
cluster	A vector or factor indicating the cluster the corresponding loglikelihood contribution belongs to. It is required to have the same length as the vector returned by logLik_vec(). If cluster is not supplied or NULL, then it is assumed that each observation forms its own cluster.
use_vcov	A logical scalar. By default, the vcov() method for x is used to estimate the Hessian of the independence loglikelihood, if the function exists. Other- wise, or if use_vcov = FALSE, H is estimated using stats::optimHess() inside chandwich::adjust_loglik().
use_mle	A logical scalar. By default, the MLE from x is taken as given, and is not reestimated. By setting use_mle to FALSE, the parameters are reestimated in the function chandwich::adjust_loglik() using stats::optim().This feature is currently for development purposes only, may return misleading/false results and may be removed without notice.
	Further arguments to be passed to sandwich::meatCL() if cluster is defined, if cluster = NULL, they are passed into sandwich::meat().

#### adj\_loglik

#### Details

If use\_vcov = TRUE, the current default, the function will test whether a vcov S3 method exists for x, and will take the variance-covariance matrix from there. Otherwise, or if use\_vcov = FALSE the variance-covariance matrix of the MLE is estimated inside chandwich::adjust\_loglik() using stats::optimHess().

## Value

An object of class "chantrics" inheriting from class "chandwich". See the documentation provided with chandwich::adjust\_loglik().

## Supported models

- glm
- glm.nb

#### Available methods

"chantrics" objects have the following methods available to them:

- AIC
- anova
- alrtest Adjusted Likelihood ratio tests
- coef
- lmtest::coeftest \(z\) tests for all coefficients
- confint and plot.confint confidence intervals for all coefficients, and diagnostics plots for confint().
- conf\_intervals enhanced confidence interval reports
- conf\_region two-dimensional confidence regions
- df.residual
- fitted
- logLik
- logLik\_vec
- nobs
- plot
- predict
- print
- residuals
- summary
- terms
- vcov

## Examples

See the model-specific pages in the supported models section.

#### References

R. E. Chandler and S. Bate, Inference for clustered data using the independence loglikelihood, Biometrika, 94 (2007), pp. 167–183. doi: 10.1093/biomet/asm015.

#### See Also

lax::alogLik() supports adjustment for user-supplied objects.

alrtest

Adjusted Likelihood Ratio Test of Nested Models

#### Description

alrtest is a helper function to simulate the functions lmtest::waldtest() and lmtest::lrtest() for adjusted chantrics objects. The method can be employed to compare nested models (see details).

#### Usage

```
alrtest(object, ...)
```

#### Arguments

object	a chantrics object as returned from adj_loglik().
	further object specifications (see details), as well as named parameters that will
	be passed to chandwich::compare_models(). The type of adjustment, out of
	"vertical", "cholesky", "spectral", "none", as specified in the parameter
	type, can also be specified here.

#### Details

This function is a helper function that creates an interface to anova.chantrics() that is similar to lmtest::waldtest() and lmtest::lrtest().

The standard method is to compare the fitted model object object with the models in .... Instead of passing the fitted models into ..., other specifications are possible. Note that the types of specifications cannot be mixed, except between numerics/characters. The type of the second object supplied determines the algorithm used.

• "chantrics" **objects**: When supplying two or more "chantrics" objects, they will be sorted as in anova.chantrics(). Then, the ALRTS will be computed consecutively between the two neighbouring models. Note that all models must be nested. For details refer to anova.chantrics().

#### anova.chantrics

- "numeric": If the second object is "numeric" or "character", then "numeric" objects corresponding element in attr(terms(object1), "term.labels") will be turned into their corresponding "character" element and will be handled as in "character" below.
- "character": If the second object is "numeric" or "character", then the "character" objects are consecutively included in an update formula like update(object1, . ~ . object2)
- "formula": If the second object is a "formula", then the second model will be computed as update(object1, object2).

Then, the adjusted likelihood ratio test statistic (ALRTS), as described in Section 3.5 of Chandler and Bate (2007), is computed by anova.chantrics().

If a single unnamed object is passed in ..., sequential ANOVA is performed on object.

#### Value

An object of class "anova" inheriting from class "data.frame". The columns are as follows:

Resid.df	The residual number of degrees of freedom in the model.
df	The increase in residual degrees of freedom with respect to the model in the row above.
ALRTS	The adjusted likelihood ratio statistic.
Pr(>ALRTS)	The p-value of the test that the model above is a "significantly better" model as the one in the current row.

#### References

R. E. Chandler and S. Bate, Inference for clustered data using the independence loglikelihood, Biometrika, 94 (2007), pp. 167–183. doi: 10.1093/biomet/asm015.

### See Also

anova.chantrics() for the implementation of the computations of the test statistics.

lmtest::waldtest() and lmtest::lrtest() for syntax.

anova.chantrics ANOVA tables: compare nested models

#### Description

anova method for chantrics objects

#### Usage

## S3 method for class 'chantrics'
anova(object, ...)

#### Arguments

object	Object of class chantrics, as returned by adj_loglik().
	Further objects of class chantrics, as returned by adj_loglik(), and named parameters that should be passed to chandwich::compare_models(). The type of adjustment, out of "vertical", "cholesky", "spectral", "none", as specified in the parameters turn, and he parameters to be parameters to be parameters.
	ified in the parameter type, can also be specified here.

#### Details

Create an analysis of adjusted deviance table for one object (sequential), or two or more nested models that have been adjusted using the adj\_loglik() method. It uses the adjusted likelihood ratio test statistic (ALRTS), as described in Section 3.5 of Chandler and Bate (2007).

Each line represents the model as given above the table, with each line (except for the first line) showing the residual degrees of freedom of that model, the change in degrees of freedom, the ALRTS and the associated p-value in comparison to the model in the line above.

When a single model is specified, the function returns a sequential analysis of deviance table, where, iteratively, one term is being removed from the right of the full formula. This process is continued until the "intercept only" model is left. The row names are the names of the dropped term in comparison to the model in the line above.

If more than one model is specified, the function sorts the models by their number of variables as returned by adj\_loglik() in attr(x, "p\_current").

Details of the ALRT can be found in chandwich::compare\_models() and in Chandler and Bate (2007).

#### Value

An object of class "anova" inheriting from class "data.frame". The columns are as follows:

Resid.df	The residual number of degrees of freedom in the model.
df	The increase in residual degrees of freedom with respect to the model in the row above.
ALRTS	The adjusted likelihood ratio statistic.
Pr(>ALRTS)	The p-value of the test that the model above is a "significantly better" model as the one in the current row.

## References

R. E. Chandler and S. Bate, Inference for clustered data using the independence loglikelihood, Biometrika, 94 (2007), pp. 167–183. doi: 10.1093/biomet/asm015.

#### See Also

chandwich::compare\_models: implementation of the comparison mechanism

#### chantrics

#### Examples

```
# from Introducing Chandwich.
set.seed(123)
x <- rnorm(250)
y <- rnbinom(250, mu = exp(1 + x), size = 1)
fm_pois <- glm(y ~ x + I(x^2), family = poisson)
fm_pois_adj <- adj_loglik(fm_pois)
fm_pois_small_adj <- update(fm_pois_adj, formula = . ~ . - I(x^2))
fm_pois_smallest_adj <- update(fm_pois_adj, formula = . ~ 1)
anova(fm_pois_adj, fm_pois_small_adj, fm_pois_smallest_adj)
# use different types of adjustment with type, default is "vertical"
anova(fm_pois_adj, fm_pois_small_adj, fm_pois_smallest_adj, type = "cholesky")
# sequential anova
anova(fm_pois_adj)
```

chantrics

chantrics: Loglikelihood Adjustments for Econometric Models

#### Description

chantrics adjusts the loglikelihood of common econometric models for clustered data based on the estimation process suggested in Chandler and Bate (2007), using the chandwich package, and provides convenience functions for inference on the adjusted models. adj\_loglik() adjusts the model's parameter covariance matrix to incorporate clustered data, and can mitigate model misspecification by wrapping chandwich::adjust\_loglik for the supported models.

#### Details

The returned model of class chantrics can be plugged into standard model evaluation and model comparison methods, for example, summary(), confint() and anova(), and a hypothesis test framework provided by alrtest().

See vignette("chantrics-vignette", package = "chantrics") for an overview of the package.

#### References

R. E. Chandler and S. Bate, Inference for clustered data using the independence loglikelihood, Biometrika, 94 (2007), pp. 167–183. doi: 10.1093/biomet/asm015.

#### Description

In a generalised linear model (glm), the user can choose between a range of distributions of a response y, and can allow for non-linear relations between the mean outcome for a particular combination of covariates x,  $E(y_i | x_i) = \mu_i$ , and the linear predictor,  $\eta_i = x_i^T \beta$ , which is the link function  $g(\mu_i) = \eta_i$ . it is required to be monotonic. (For a quick introduction, see Kleiber and Zeileis (2008, Ch. 5.1), for more complete coverage of the topic, see, for example, Davison (2003, Ch. 10.3))

#### Details

For more usage examples and more information on glm models, see the *Introducing* chantrics vignette by running vignette("chantrics-vignette", package = "chantrics")

#### Supported families (within each family, any link function should work)

- gaussian
- poisson
- binomial
- MASS::negative.binomial

Also works for MASS::glm.nb(), note that the standard errors of the theta are not adjusted.

#### References

Davison, A. C. 2003. Statistical Models. Cambridge Series on Statistical and Probabilistic Mathematics 11. Cambridge University Press, Cambridge.

Kleiber, Christian, and Achim Zeileis. 2008. Applied Econometrics with R. Edited by Robert Gentleman, Kurt Hornik, and Giovanni Parmigiani. Use r! New York: Springer-Verlag.

#### Examples

```
# binomial example from Applied Econometrics in R, Kleiber/Zeileis (2008)
# == probit ==
data("SwissLabor", package = "AER")
swiss_probit <- glm(participation ~ . + I(age^2),
    data = SwissLabor,
    family = binomial(link = "probit")
)
summary(swiss_probit)
swiss_probit_adj <- adj_loglik(swiss_probit)
summary(swiss_probit_adj)
# == logit ==
swiss_logit <- glm(participation ~ . + I(age^2),</pre>
```

## glm

#### logLik\_vec

```
data = SwissLabor,
  family = binomial(link = "logit")
)
summary(swiss_logit)
swiss_logit_adj <- adj_loglik(swiss_logit)
summary(swiss_logit_adj)
```

```
logLik_vec
```

Evaluate loglikelihood contributions from specific observations

#### Description

Generic function for calculating the loglikelihood contributions from individual observations for a fitted model.

#### Usage

logLik\_vec(object, ...)

#### Arguments

object	A fitted model object.
	Further arguments.

#### Value

An object of class "logLik\_vec", which is a numeric vector of length nobs(object) (i.e. the number of observations in object) of the loglikelihood of each observation. Additionally, it contains the attributes df (model degrees of freedom) and nobs (number of observations).

The methods stats::logLik(), and stats::nobs() are available.

#### See Also

stats::logLik()

predict.chantrics Predict Method for chantrics fits

### Description

Obtains predictions from chantrics objects. The function can currently only supply predictions of the link and the response values of the data used for the fit.

#### Usage

```
## S3 method for class 'chantrics'
predict(object, newdata = NULL, type = c("response", "link"), ...)
```

## Arguments

object	Object of class chantrics, as returned by adj_loglik()
newdata	optionally, a data frame in which to look for variables with which to predict. If omitted, the fitted linear predictors are used. Supplying new data is currently not supported.
type	the type of prediction required. The default "response" is on the scale of the re- sponse variables. The alternative "link" is on the scale of the linear predictors, if applicable. Otherwise, an error is returned.
	unused.

## Details

If newdata is omitted, the predictions are based on the data used for the fit. Any instances of NA will return NA.

#### Value

A vector of predictions.

residuals.chantrics Residuals of chantrics model fits

#### Description

residuals() returns the residuals specified in type from a "chantrics" object.

## Usage

```
## S3 method for class 'chantrics'
residuals(object, type = c("response", "working", "pearson"), ...)
```

#### Arguments

object	an object of class "chantrics", returned by adj_loglik().
type	the type of residuals which should be returned. The alternatives are: "response" (default), "working", and "pearson" (for glm fits).
	further arguments passed to or from other methods

## Details

The different types of residuals are as in stats::residuals.glm().

## Value

A vector of residuals.

#### update.chantrics

#### References

A. C. Davison and E. J. Snell, Residuals and diagnostics. In: Statistical Theory and Modelling. In Honour of Sir David Cox, FRS, 1991. Eds. Hinkley, D. V., Reid, N. and Snell, E. J., Chapman & Hall.

M. Döring, Interpreting Generalised Linear Models. In: Data Science Blog, 2018. https://www. datascienceblog.net/post/machine-learning/interpreting\_generalized\_linear\_models/

#### See Also

adj\_loglik() for model fitting, stats::residuals.glm(), and stats::residuals().

update.chantrics Update, re-fit and re-adjust a Model Call

#### Description

update.chantrics() will update a model that has been adjusted by adj\_loglik(). It passes all arguments to the standard stats::update() function.

#### Usage

## S3 method for class 'chantrics'
update(object, ...)

## Arguments

object	A "chantrics" returned by adj_loglik().
	Additional arguments to the call, passed to stats::update() to update the orig- inal model specification.

## Details

The function cannot change any arguments passed to the adj\_loglik() function. To change any of these arguments, re-run adj\_loglik().

Passing evaluate = FALSE is not supported, if this is required, run stats::update() on the unadjusted object.

## Value

The fitted, adjusted "chantrics" object.

#### See Also

stats::update()
stats::update.formula()

## Examples

```
# from Introducing Chandwich.
set.seed(123)
x <- rnorm(250)
y <- rnbinom(250, mu = exp(1 + x), size = 1)
fm_pois <- glm(y ~ x + I(x^2), family = poisson)
fm_pois_adj <- adj_loglik(fm_pois)
fm_pois_small_adj <- update(fm_pois_adj, formula = . ~ . - I(x^2))
summary(fm_pois_small_adj)
fm_pois_smallest_adj <- update(fm_pois_adj, formula = . ~ 1)
summary(fm_pois_smallest_adj)
```

12

# Index

```
adj_loglik, 2
adj_loglik(), 4, 6, 10, 11
AIC, 3
alrtest, 3, 4
anova, 3
anova.chantrics.5
anova.chantrics(), 4, 5
chandwich::adjust_loglik(), 2, 3
chandwich::compare_models,6
chandwich::compare_models(), 4, 6
chantrics, 7
coef. 3
coef.chantrics(adj_loglik), 2
coeftest.chantrics(adj_loglik), 2
conf_intervals, 3
conf_intervals.chantrics(adj_loglik), 2
conf_region, 3
conf_region.chantrics(adj_loglik), 2
confint, 3
confint.chantrics(adj_loglik), 2
df.residual, 3
fitted, 3
glm, 3, 8
glm.nb, 3
lax::alogLik(), 4
lmtest::coeftest, 3
lmtest::lrtest(), 4, 5
lmtest::waldtest(), 4, 5
logLik, 3
logLik.chantrics(adj_loglik), 2
logLik_vec, 3, 9
logLik_vec(), 2
MASS::glm.nb(), 8
nobs, 3
```

plot, 3 plot.chantrics(adj\_loglik), 2 plot.confint, 3predict, 3 predict.chantrics,9 print, 3 print.chantrics(adj\_loglik), 2 residuals, 3 residuals.chantrics, 10 sandwich::meat(), 2 sandwich::meatCL(), 2 stats::logLik(),9 stats::nobs(), 9 stats::optim(), 2 stats::optimHess(), 2, 3 stats::residuals(), 11 stats::residuals.glm(), 10, 11 stats::update(), 11 stats::update.formula(), 11 summary, 3 summary.chantrics(adj\_loglik), 2 terms, 3update.chantrics, 11 vcov, 3vcov(), 2vcov.chantrics(adj\_loglik), 2