# Package 'logNormReg’ 

October 13, 2022
Type Package
Title $\log$ Normal Linear Regression
Version 0.5-0
Date 2021-11-08
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Description Functions to fits simple linear regression models with log normal errorsand identity link, i.e. taking the responses on the original scale. SeeMuggeo (2018) [doi:10.13140/RG.2.2.18118.16965](doi:10.13140/RG.2.2.18118.16965).
Depends R (>= 3.5.0)
License GPL
NeedsCompilation no
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Repository CRAN
Date/Publication 2021-11-08 17:00:02 UTC
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## Description

Functions to perform and to display results from simple multiple linear regression with log Normal errors and identity link. Standard errors of estimates are based on the sandwich formula.

## Details

| Package: | logNormReg |
| :--- | :--- |
| Type: | Package |
| Version: | $0.5-0$ |
| Date: | $2021-11-08$ |
| License: | GPL |

## Acknowledgement

This package was inspired by a fruitful discussion with Andrew Beet (Marine Policy Center, Woods Hole Oceanographic Institution, U.S.).

## Author(s)

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## References

Gustavsson, S., Fagerberg, B., Sallsten, G., Andersson, E. M. (2014). Regression Models for LogNormal Data: Comparing Different Methods for Quantifying the Association between Abdominal Adiposity and Biomarkers of Inflammation and Insulin Resistance . International Journal of Environmental Research and Public Health, 11, 3521-3539.

Muggeo, V.M.R. (2018) A note on regression with log Normal errors: linear and piecewise linear modelling in R, doi: $10.13140 /$ RG.2.2.18118.16965.

## See Also

See lognlm for the main function with a toy example.
See also package gamlss for more general regression models including log Normal errors.

## Description

Computes confidence intervals (based on the Gradient, Wald or Likelihood Ratio sattistic) for the linear parameters in a fitted 'lognreg' model.

## Usage

```
## S3 method for class 'lognlm'
confint(object, parm, level=0.95, type = c("wald", "gradient", "lrt"), ...)
```


## Arguments

object a fitted lognlm object.
parm the parameter of interest. Numeric (covariate number) or character (covariate name). If missing parm=2 is taken, i.e. the coefficient of the first covariate, provided the intercept is in the model.
level the required confidence level (default to 0.95 ).
type Which statistics should be used? Currently "wald", "gradient", or "lrt". Names can be abbreviated. If object has been obtained with lik=FALSE, only type="wald" or "gradient" is permitted.
... When type is not "wald", other optional arguments to be passed on the internal functions:

- lim to specify the range of the evaluation points (default to $(-3,3)$ resulting in the interval $\hat{\beta} \pm 3 \times \mathrm{SE}(\hat{\beta})$ );
- values to set explicitly the evaluation point(s);
- return.val to return (if TRUE) the evaluation points and the corresponding statistic values (useful to plot the profiled statistic). If the supplied values includes just one scalar, return.val is set to TRUE.


## Details

Confidence intervals are computed and returned. Currently the Wald, Gradient or Likelihood ratio statistic can be used. Based on some simulation experiments the simple Wald based CIs appears adeguate to guarantee the nominal coverage levels.

## Value

The end-points of confidence intervals.

## Author(s)

Vito Muggeo

## References

For a gentle and general introduction about the likelihood-based statistics (including the gradient) see
Muggeo V.M.R., Lovison G. (2014), The 'three plus one' likelihood-based test statistics: unified geometrical and graphical interpretations. The American Statistician, 68, 302-306.

## See Also

lognlm

## Examples

```
n=50
s=.4
set.seed(1515) #just to get reproducible results..
#covariates
x<-seq(.1,10,l=n)
z<-rnorm(n)
#response
mu<- 10+.5*x- z #linear regression function
y<-rlnorm(n, log(mu)-s^2/2, s) #data..
o<- lognlm(y~x+z, lik=TRUE) #ML estimation
confint(o, "x", type="g")
confint(o, "z", type="w") #same than confint.default(o)
```

logLik. lognlm Log Likelihood for log Normal linear regression

## Description

The function returns the log-likelihood value of the log Normal linear regression model evaluated at the estimated coefficients

## Usage

\#\# S3 method for class 'lognlm'
logLik(object, full=FALSE, ...)
\#\# S3 method for class 'lognlm'
extractAIC(fit, scale=0, k=2, ...)

## Arguments

object, fit A lognlm fit returned by lognlm()
full If FALSE, only the kernel of the log likelihood is returned, otherwise the complete log likelihood (including terms depending on data only)
scale Optional numeric specifying the scale parameter of the model. Currenty not used.
$\mathrm{k} \quad$ Optional numeric specifying the penalty of the edf in the AIC formula. If $\mathrm{k}<=0$, the BIC is returned.
.. optional arguments (nothing in this method).

## Details

If object has been obtained via lognlm( . . , lik=TRUE), logLik. lognlm returns the log likelihood (kernel or complete, depending on argument full), otherwise the sum of $\log$ residuals, $\sum\left(\log \left(y_{i}\right)-\right.$ $\left.\left.\log \left(\hat{\mu}_{i}\right)\right)^{2}\right)$. The value returned by AIC is based on the kernel log likelihood or the the sum of $\log$ residuals, while extractAIC can return the AIC (or BIC) using the full log likelihood (via extractAIC(.., full=TRUE))

## Value

The $\log$ likelihood (or the sum of $\log$ residuals squared) of the model fit object

## Author(s)

Vito Muggeo

## See Also

lognlm

## Examples

```
# o is the fit object, see ?lognlm
n=50
s=. }
#covariates
x<-seq(.1,10,l=n)
#response
set.seed(1234) #just to get reproducible results..
mu<- 10+.5*x #linear regression function
y<-rlnorm(n, log(mu)-s^2/2, s) #data..
o<- lognlm(y~x, lik=TRUE) #the model
logLik(o) #the kernel log likelihood value
logLik(o, full=TRUE)
```


## lognlm Multiple linear regression with log Normal errors

## Description

The function fits simple multiple linear regression models with log Normals erros. Two objectives as well as two optimizing functions can be used.

## Usage

lognlm(formula, data, subset, weights, na.action, y = TRUE, start, model = TRUE, lik = FALSE, opt = c("nlminb", "optim"), contrasts=NULL, ...)

## Arguments

| formula | a standard R formula with response and explanatory variables (and possible offset) specifying the regression model being fitted. |
| :---: | :---: |
| data | an optional data frame, list or environment containing some or all the variables in the model. |
| subset | an optional vector specifying a subset of observations to be used in the fitting process. |
| weights | an optional vector of (positive) weights to be used in the fitting process. Currently implemented only if lik=FALSE. |
| na.action | a function indicating what should happen when the data contain NAs. The default is set by the na.action setting of options. |
| y | logical. If TRUE the response vector is returned as y in the fit object. |
| start | (optional) starting values of the parameter to be estimated. If start is missing they are computed via ordinary least squares with the intercept $\hat{\beta}_{0}$ replaced by $\max \left(\hat{\beta}_{0}\right.$, median $\left.\left\{y_{i}\right\}\right)$. <br> If lik=TRUE (i.e. a $\log$ Normal model is fitted), start refers to the regression parameters and the error standard deviation; if lik=FALSE, start does not include the starting guess for the standard deviation. |
| model | logical. If TRUE the model frame is returned as model in the fit object. |
| lik | If TRUE the $\log$ Normal $\log$ likelihood is optimized, otherwise the sum of squared residuals based on the logs (see Details). |
| opt | the optimization function to be used. nlminb appears to be more efficient, probably because it uses (unlike optim) also the hessian matrix (supplied in the code). However results are often indistinguishable. |
| contrasts | an optional list. See the contrasts.arg of model.matrix.default. |
|  | optional arguments passed on to the optimizing functions (nlminb or optim), (and therefore should be consistent with that). |

## Details

lognlm fits simple linear regression models with log Normal errors and identity link. Actually two objectives could be used.
If lik=TRUE the usual log Normal likelihood is optimized, otherwise estimation is based on minimization of the following loss function

$$
\sum_{i}\left(\log y_{i}-\log \mu_{i}\right)^{2}
$$

where $\mu_{i}=x_{i}^{T} \beta$ is the mean function equal to the linear predictor (as an identity link is exploited).

## Value

A list with components
coefficients the regression parameters estimate.
loglik The objective function value, namely the log Normal log likelihood or the sum of the squared 'log residuals' (depending on lik option).
s2
the error variance estimate.
fitted.values the fitted values.
residuals the raw residuals on the original scale, i.e. 'observed - fitted'.
grad the gradient at solution.
hessian the hessian matrix at solution.
Ehessian the expected hessian matrix at solution (only if lik=FALSE).
convergence the convergence code coming from the fitter function. 0 means succefull convergence.
call the matched call.
$y \quad$ the response vector (provided that $\mathrm{y}=$ TRUE has been set).
opt the employed optimizer.
lik logical, indicating if the fit comes from a log Normal likelihood approach.
xlevels (only where relevant) a record of the levels of the factors used in fitting.
terms the terms object used.
contrasts (only where relevant) the contrasts used.
model if requested, i.e. model=TRUE has been set (the default), the model frame used.
offset the (possible) offset used.

## Author(s)

Vito M.R. Muggeo

## See Also

See also print.lognlm and summary. lognlm to display results.

## Examples

```
n=300
s=.4
set.seed(123) #just to get reproducible results..
x<-seq(.1,10,l=n) #covariate
mu<- 10+2*x #linear regression function
y<-rlnorm(n, log(mu)-s^2/2, s) #data..
o0<-lm(log(y)~x) #the usual but WRONG model
o<- lognlm(y~x, lik=TRUE) #fit the 'right' model by ML
plot(x,y)
lines(x, mu, lwd=2)
points(x, exp(fitted(o0)), col=2, type="l", lwd=2)
points(x, fitted(o), col=3, type="l", lwd=2)
legend("topleft", legend=c("true", "lm(log(y)~x)", "lognlm(y~x)"),
    col=c(1,2,3), lwd=2)
#Sometimes people would estimate parameters by minimizing a least square objective
# (i.e. by setting 'lik=FALSE', see Details), wherein data would come from
# Y = mu * exp(eps) where eps~N(0,s)..
y1<-mu*exp(rnorm(n,0,1)) #data..
o1<-lognlm(y1~x, lik=FALSE) #set 'lik=FALSE', see Details
```


## Description

lognlm.fit is called by lognlm to fit log Normal linear regression models. Two optimizing functions can be used, nlminb and optim. This function is not meant to be called by the user directly.

## Usage

lognlm.fit(X, y, par, lik = TRUE, opt = c("nlminb", "optim"), offset=NULL, weights=NULL,...)

## Arguments

X
design matrix for standard linear terms.
$y \quad$ vector of observations of length $n$.
par starting values of parameters to be estimated.
lik logical. See lik in lognlm
opt the optimizing algorithm. Default to nlminb.

| offset | a possible offset term. |
| :--- | :--- |
| weights | apossible weights to be used if lik=FALSE. |
| $\ldots$ | other arguments to be passed to the optimizer specified in opt. |

## Details

See lognlm for more details on the arguments and returned objects.

## Value

A list of fit information

## Note

This function should usually not be used directly by the user.

## Author(s)

Vito M.R. Muggeo

## See Also

nlminb, optim, lognlm

## Examples

\#\# See ?lognlm
palermo Air quality in Palermo (Italy), 1997-2001

## Description

Daily time series of some pollutants and meteorological variables in Palermo, 1997-2001

## Usage

data("palermo")

## Format

A data frame with 1826 observations on the following 8 variables.
day day of month
month month of year
year year
so2 Sulfur dioxide
no2 Nitrogen dioxide
pm10 particular matter
temp tempearture (degrees Celsius)
hum air humidity (\%)

## Details

Data refer to air pollution, temperature and humidity registered in Palermo, (Sicily, Italy) in 19972001. Data are averages from eight monitoring stations in the city.

## Examples

```
## Not run:
data(palermo)
o<-lognlm(pm10 ~ temp + hum, data=palermo)
```

\#\# End(Not run)
paris PM2.5 and PM10 measurements in Paris in 2019

## Description

Hourly time series of PM2.5 and PM10 measurements in Paris in 2019

## Usage

```
data("paris")
```


## Format

A data frame with 647 observations on the following 4 variables.
utc date and time of measurements
pm25 The PM2.5 measurements
pm10 The PM10 measurements
hours numeric, the measurement hours

## Details

Ambient particulate matter measurements (PM 2.5 and PM 10) measured by reference-grade instruments for Paris - Centre, hourly measurements for July 2019. Non-physical measurements (zero values and outliers with PM2.5 greater than $2 \times \mathrm{xPM} 10$ ) were removed, as mass of PM2.5 is a fraction of mass of PM10 by definition.

## Source

European Environmental Agency, through Open AQ (https://openaq.org/\#/location/4146). Thanks to Vito Ilacqua (EPA) for pointing out that.

## Examples

```
data(paris)
plot(pm10~pm25, data=paris)
o<-lm(pm10~pm25, data=paris) #negative intercept! it's meaningless..
o1<-lognlm(pm10 ~ pm25, data=paris, lik=TRUE)
abline(coef=coef(o), col=2)
abline(coef=coef(o1), col=3)
```

print.lognlm Print method for the lognlm class

## Description

Printing the most important feautures of a 'lognlm' model.

## Usage

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


## Arguments

x
digits number of digits to be printed
$\ldots \quad$ arguments passed to other functions

## Author(s)

Vito M.R. Muggeo

See Also

## Description

summary method for class lognlm.

## Usage

```
## S3 method for class 'lognlm'
summary(object, ...)
## S3 method for class 'summary.lognlm'
print(x, digits = max(3L, getOption("digits") - 3L),
    signif.stars = getOption("show.signif.stars"), ...)
```


## Arguments

| object | object of class "lognreg". |
| :--- | :--- |
| x | a summary. segmented object produced by summary. segmented(). |
| digits | controls number of digits printed in output. |
| signif.stars | logical, should stars be printed on summary tables of coefficients? |
| $\ldots$ | further arguments to be passed to vcov, for instance sandw=TRUE. |

## Details

These functions compute and print some useful information relevant to "lognlm" fits, including point estimates, standard errors and p-values.

## Value

A list (similar to one returned by lognlm with additional components, such as the estimate standard errors and corresponding p -values.

## Author(s)

Vito Muggeo

## See Also

See also lognlm and vcov. lognlm

## Examples

```
    ## Not run:
    n=20
    s=.2
    set.seed(10) #just to get reproducible results..
    #covariates
    x<-seq(.1,10,l=n)
    z<-rnorm(n)
    #response
    mu<- 10+.5*x- z #linear regression function
    y<-rlnorm(n, log(mu)-s^2/2, s) #data..
    o<- lognlm(y~x+z) #the model
    summary(o, sandw=TRUE)
    ## End(Not run)
```

    vcov.lognlm Covariance matrix for lognlm fits
    
## Description

Computes covariance matrix of parameter estimates from a lognlm fit via the sandwich formula.

## Usage

```
\#\# S3 method for class 'lognlm'
vcov(object, emp = FALSE, exH = TRUE, se = FALSE, ...)
```


## Arguments

object
emp logical; if TRUE, the 'meat' (i.e the information matrix) is computed empirically by the outer product of the individual score contributions.
exH logical; if TRUE the expected (rather than the observed) hessian is used in the sandwich formula.
se logical; if TRUE the square root of the elements of the main diagonal are returned (rather than the whole matrix).
$\ldots \quad$ additional arguments.

## Details

If object has been obtained via lognlm(.., lik=TRUE) the returned covariance matrix (or standard errors only) refers to regression coefficients and the log response standard deviation. Otherwise (if lik=FALSE has been set), it includes entries relevant to regression coefficients only. The var-covariance matrix comes from the sandwich formula using expected (if exH=TRUE) or the observed (if exH=FALSE) hessian at solution. Some simulations under correct model specification show that emp=TRUE and exH=FALSE lead to somewhat more unstable standard errors.

## Value

The variance-covariance matrix of the parameter estimates, if se=FALSE; otherwise the square root of the main diagonal entries.

## Note

Currently for likelihood-based fits, exH=FALSE and emp=TRUE are always set.

## Author(s)

Vito Muggeo

## See Also

lognlm

## Examples

```
n=50
s=. }
#covariates
x<-seq(.1,10,l=n)
z<-rnorm(n)
#response
mu<- 10+.5*x- z #linear regression function
y<-rlnorm(n, log(mu)-s^2/2, s) #data..
o<- lognlm(y~x+z, lik=TRUE) #the model
vcov(o) #the full covariance matrix
vcov(o, se=TRUE) #st.errs only
```


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