# Package 'betaDelta'

June 21, 2024

```
Title Confidence Intervals for Standardized Regression Coefficients
```

Version 1.0.5.9000

```
Description Generates confidence intervals for standardized regression coefficients using delta method standard errors for models fitted by lm() as described in Yuan and Chan (2011) <doi:10.1007/s11336-011-9224-6> and Jones and Waller (2015) <doi:10.1007/s11336-013-9380-y>.

The package can also be used to generate confidence intervals for differences of standardized regression coefficients and as a general approach to performing the delta method.

A description of the package and code examples are presented in Pesigan, Sun, and Cheung (2023) <doi:10.1080/00273171.2023.2201277>.
```

```
URL https://github.com/jeksterslab/betaDelta,
   https://jeksterslab.github.io/betaDelta/
```

```
BugReports https://github.com/jeksterslab/betaDelta/issues
```

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**Encoding UTF-8** 

LazyData true

**Roxygen** list(markdown = TRUE)

**Depends** R (>= 3.5.0)

Imports numDeriv

Suggests knitr, rmarkdown, testthat, betaSandwich

RoxygenNote 7.3.1

NeedsCompilation no

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# Description

Estimate Standardized Regression Coefficients and the Corresponding Sampling Covariance Matrix

## Usage

```
BetaDelta(object, type = "mvn", alpha = c(0.05, 0.01, 0.001))
```

# Arguments

object	Object of class 1m.
type	Character string. If type = "mvn", use the multivariate normal-theory approach. If type = "adf", use the asymptotic distribution-free approach.
alpha	Numeric vector. Significance level $\alpha$ .

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#### Value

Returns an object of class betadelta which is a list with the following elements:

call Function call.

args Function arguments.

lm\_process Processed 1m object.

gamma Asymptotic covariance matrix of the sample covariance matrix.

**acov** Asymptotic covariance matrix of the standardized slopes.

vcov Sampling covariance matrix of the standardized slopes.

est Vector of standardized slopes.

#### Author(s)

Ivan Jacob Agaloos Pesigan

#### References

Jones, J. A., & Waller, N. G. (2015). The normal-theory and asymptotic distribution-free (ADF) covariance matrix of standardized regression coefficients: Theoretical extensions and finite sample behavior. *Psychometrika*, 80(2), 365–378. doi:10.1007/s113360139380y

Pesigan, I. J. A., Sun, R. W., & Cheung, S. F. (2023). betaDelta and betaSandwich: Confidence intervals for standardized regression coefficients in R. *Multivariate Behavioral Research*. doi:10.1080/00273171.2023.2201277

Yuan, K.-H., & Chan, W. (2011). Biases and standard errors of standardized regression coefficients. *Psychometrika*, 76(4), 670–690. doi:10.1007/s1133601192246

#### See Also

Other Beta Delta Functions: DiffBetaDelta()

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
# Methods ------
print(std)
summary(std)
coef(std)
vcov(std)
confint(std, level = 0.95)</pre>
```

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coef.betadelta

Standardized Regression Slopes

## Description

Standardized Regression Slopes

## Usage

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

## Arguments

```
object Object of class betadelta. ... additional arguments.
```

#### Value

Returns a vector of standardized regression slopes.

## Author(s)

Ivan Jacob Agaloos Pesigan

## **Examples**

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
coef(std)</pre>
```

coef.deltamethod

Estimates

## Description

Estimates

## Usage

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

coef.diffbetadelta 5

#### **Arguments**

```
object Object of class deltamethod.
... additional arguments.
```

#### Value

Returns a vector of estimates.

#### Author(s)

Ivan Jacob Agaloos Pesigan

## **Examples**

```
object <- glm(
  formula = vs ~ wt + disp,
  family = "binomial",
  data = mtcars
)
def <- list("exp(wt)", "exp(disp)")
out <- DeltaGeneric(
  object = object,
  def = def,
  alpha = 0.05
)
coef(out)</pre>
```

coef.diffbetadelta

Differences of Standardized Regression Slopes

## Description

Differences of Standardized Regression Slopes

## Usage

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

## **Arguments**

```
object Object of class diffbetadelta. ... additional arguments.
```

## Value

Returns a vector of differences of standardized regression slopes.

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#### Author(s)

Ivan Jacob Agaloos Pesigan

#### **Examples**

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
diff <- DiffBetaDelta(std)
coef(diff)</pre>
```

confint.betadelta

Confidence Intervals for Standardized Regression Slopes

#### **Description**

Confidence Intervals for Standardized Regression Slopes

## Usage

```
## S3 method for class 'betadelta'
confint(object, parm = NULL, level = 0.95, ...)
```

## **Arguments**

object Object of class betadelta.

parm a specification of which parameters are to be given confidence intervals, either

a vector of numbers or a vector of names. If missing, all parameters are consid-

ered.

level the confidence level required.

... additional arguments.

#### Value

Returns a matrix of confidence intervals.

## Author(s)

Ivan Jacob Agaloos Pesigan

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
confint(std, level = 0.95)</pre>
```

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confint.deltamethod Confidence Intervals

## Description

Confidence Intervals

## Usage

```
## S3 method for class 'deltamethod'
confint(object, parm = NULL, level = 0.95, ...)
```

## **Arguments**

object Object of class deltamethod.

parm a specification of which parameters are to be given confidence intervals, either

a vector of numbers or a vector of names. If missing, all parameters are consid-

ered.

level the confidence level required.

... additional arguments.

#### Value

Returns a matrix of confidence intervals.

#### Author(s)

Ivan Jacob Agaloos Pesigan

```
object <- glm(
  formula = vs ~ wt + disp,
  family = "binomial",
  data = mtcars
)
def <- list("exp(wt)", "exp(disp)")
out <- DeltaGeneric(
  object = object,
  def = def,
  alpha = 0.05
)
confint(out, level = 0.95)</pre>
```

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 ${\it confint.diffbetadelta} \ \ {\it Confidence\ Intervals\ for\ Differences\ of\ Standardized\ Regression} \\ Slopes$ 

## Description

Confidence Intervals for Differences of Standardized Regression Slopes

## Usage

```
## S3 method for class 'diffbetadelta'
confint(object, parm = NULL, level = 0.95, ...)
```

## **Arguments**

object Object of class diffbetadelta.

parm a specification of which parameters are to be given confidence intervals, either

a vector of numbers or a vector of names. If missing, all parameters are consid-

ered.

level the confidence level required.

... additional arguments.

#### Value

Returns a matrix of confidence intervals.

## Author(s)

Ivan Jacob Agaloos Pesigan

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
diff <- DiffBetaDelta(std)
confint(diff)</pre>
```

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Delta	Delta Method	

## Description

Calculates delta method sampling variance-covariance matrix for a function of parameters using a numerical Jacobian.

## Usage

```
Delta(
    coef,
    vcov,
    func,
    ...,
    theta = 0,
    alpha = c(0.05, 0.01, 0.001),
    z = TRUE,
    df = NULL
)
```

## Arguments

coef	Numeric vector. Vector of parameters.
vcov	Numeric matrix. Matrix of sampling variance-covariance matrix of parameters.
func	R function.
	1. The first argument x is the argument coef.
	2. The function algebraically manipulates coef to return a new numeric vector. It is best to have a named vector as an output.
	3. The function can take additional named arguments passed using
	Additional arguments to pass to func.
theta	Numeric vector. Parameter values when the null hypothesis is true.
alpha	Numeric vector. Significance level/s.
Z	Logical. If $z$ = TRUE, use the standard normal distribution. If $z$ = FALSE, use the t distribution.
df	Numeric. Degrees of freedom if $z = FALSE$ .

## Value

Returns an object of class deltamethod which is a list with the following elements:

```
call Function call.args Function arguments.coef Estimates.
```

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```
vcov Sampling variance-covariance matrix.jacobian Jacobian matrix.fun Function used ("Delta").
```

## Author(s)

Ivan Jacob Agaloos Pesigan

#### See Also

Other Delta Method Functions: DeltaGeneric()

## **Examples**

```
object <- glm(
  formula = vs ~ wt + disp,
  family = "binomial",
  data = mtcars
)
func <- function(x) {
  y <- exp(x)
  names(y) <- paste0("exp", "(", names(x), ")")
  return(y[-1])
}
Delta(
  coef = coef(object),
  vcov = vcov(object),
  func = func,
  alpha = 0.05
)</pre>
```

DeltaGeneric

Delta Method (Generic Object Input)

## **Description**

Calculates delta method sampling variance-covariance matrix for a function of parameters using a numerical Jacobian.

## Usage

```
DeltaGeneric(
   object,
   def,
   theta = 0,
   alpha = c(0.05, 0.01, 0.001),
   z = TRUE,
   df = NULL
)
```

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## Arguments

object	R object. Fitted model object with coef and vcov methods that return a named vector of estimated parameters and sampling variance-covariance matrix, respectively.
def	List of character strings. A list of defined functions of parameters. The string should be a valid R expression when parsed and should result a single value when evaluated.
theta	Numeric vector. Parameter values when the null hypothesis is true.
alpha	Numeric vector. Significance level/s.
z	Logical. If $z$ = TRUE, use the standard normal distribution. If $z$ = FALSE, use the t distribution.
df	Numeric. Degrees of freedom if z = FALSE.

## Value

Returns an object of class deltamethod which is a list with the following elements:

```
call Function call.
args Function arguments.
coef Estimates.
vcov Sampling variance-covariance matrix.
jacobian Jacobian matrix.
fun Function used ("DeltaGeneric").
```

## Author(s)

Ivan Jacob Agaloos Pesigan

#### See Also

Other Delta Method Functions: Delta()

```
object <- glm(
  formula = vs ~ wt + disp,
  family = "binomial",
  data = mtcars
)
def <- list("exp(wt)", "exp(disp)")
DeltaGeneric(
  object = object,
  def = def,
  alpha = 0.05
)</pre>
```

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DiffBetaDelta	Estimate Differences of Standardized Slopes and the Corresponding Sampling Covariance Matrix
	Sampana Coran tance Islan as

## **Description**

Estimate Differences of Standardized Slopes and the Corresponding Sampling Covariance Matrix

#### Usage

```
DiffBetaDelta(object, alpha = c(0.05, 0.01, 0.001))
```

## Arguments

Object of class betadelta, that is, the output of the BetaDelta() function.

alpha Numeric vector. Significance level  $\alpha$ .

#### Value

Returns an object of class diffbetadelta which is a list with the following elements:

call Function call.

fit The argument object.

**args** Function arguments.

vcov Sampling covariance matrix of differences of standardized slopes.

est Vector of differences of standardized slopes.

#### Author(s)

Ivan Jacob Agaloos Pesigan

## See Also

```
Other Beta Delta Functions: BetaDelta()
```

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
diff <- DiffBetaDelta(std)
# Methods -------
print(diff)
summary(diff)
coef(diff)
vcov(diff)
confint(diff, level = 0.95)</pre>
```

nas1982

nas1982

1982 National Academy of Sciences Doctoral Programs Data

## **Description**

1982 National Academy of Sciences Doctoral Programs Data

#### Usage

nas1982

#### **Format**

Ratings of 46 doctoral programs in psychology in the USA with the following variables:

**QUALITY** Program quality ratings.

**NFACUL** Number of faculty members in the program.

NGRADS Number of program graduates.

PCTSUPP Percentage of program graduates who received support.

**PCTGRT** Percent of faculty members holding research grants.

NARTIC Number of published articles attributed to program faculty member.

PCTPUB Percent of faculty with one or more published article.

#### References

National Research Council. (1982). An assessment of research-doctorate programs in the United States: Social and behavioral sciences. doi:10.17226/9781. Reproduced with permission from the National Academy of Sciences, Courtesy of the National Academies Press, Washington, D.C.

print.betadelta

Print Method for an Object of Class betadelta

#### **Description**

Print Method for an Object of Class betadelta

## Usage

```
## S3 method for class 'betadelta'
print(x, alpha = NULL, digits = 4, ...)
```

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## **Arguments**

Х	Object of class betadelta.
alpha	Numeric vector. Significance level $\alpha$ . If alpha = NULL, use the argument alpha used in x.
digits	Digits to print.
	additional arguments.

#### Value

Returns a matrix of standardized regression slopes, standard errors, test statistics, degrees of freedom, p-values, and confidence intervals.

## Author(s)

Ivan Jacob Agaloos Pesigan

## **Examples**

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
print(std)</pre>
```

print.deltamethod

Print Method for an Object of Class deltamethod

## **Description**

Print Method for an Object of Class deltamethod

## Usage

```
## S3 method for class 'deltamethod'
print(x, alpha = NULL, digits = 4, ...)
```

## Arguments

X	Object of class deltamethod.
alpha	Numeric vector. Significance level $\alpha$ . If alpha = NULL, use the argument alpha used in x.
digits	Digits to print.
	additional arguments.

## Value

Returns a matrix of coefficients, standard errors, test statistics, degrees of freedom (if z = FALSE), p-values, and confidence intervals.

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#### Author(s)

Ivan Jacob Agaloos Pesigan

## **Examples**

```
object <- glm(
  formula = vs ~ wt + disp,
  family = "binomial",
  data = mtcars
)
def <- list("exp(wt)", "exp(disp)")
out <- DeltaGeneric(
  object = object,
  def = def,
  alpha = 0.05
)
print(out)</pre>
```

print.diffbetadelta

Print Method for an Object of Class diffbetadelta

## **Description**

Print Method for an Object of Class diffbetadelta

#### Usage

```
## S3 method for class 'diffbetadelta'
print(x, alpha = NULL, digits = 4, ...)
```

## Arguments

X	Object of class diffbetadelta.
alpha	Numeric vector. Significance level $\alpha$ . If alpha = NULL, use the argument alpha used in x.
digits	Digits to print.
	additional arguments.

## Value

Returns a matrix of standardized regression slopes, standard errors, test statistics, degrees of freedom, p-values, and confidence intervals.

## Author(s)

Ivan Jacob Agaloos Pesigan

summary.betadelta

#### **Examples**

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
diff <- DiffBetaDelta(std)
print(diff)</pre>
```

summary.betadelta

Summary Method for an Object of Class betadelta

## **Description**

Summary Method for an Object of Class betadelta

## Usage

```
## S3 method for class 'betadelta'
summary(object, alpha = NULL, digits = 4, ...)
```

## Arguments

object Object of class betadelta. 
alpha Numeric vector. Significance level  $\alpha$ . If alpha = NULL, use the argument alpha used in object. 
digits Digits to print.

digits to pint.

... additional arguments.

#### Value

Returns a matrix of standardized regression slopes, standard errors, test statistics, degrees of freedom, p-values, and confidence intervals.

## Author(s)

Ivan Jacob Agaloos Pesigan

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
summary(std)</pre>
```

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summary.deltamethod

Summary Method for an Object of Class deltamethod

## Description

Summary Method for an Object of Class deltamethod

## Usage

```
## S3 method for class 'deltamethod'
summary(object, alpha = NULL, digits = 4, ...)
```

## **Arguments**

object	Object of class deltamethod.
alpha	Numeric vector. Significance level $\alpha.$ If alpha = NULL, use the argument alpha used in object.
digits	Digits to print.
	additional arguments.

#### Value

Returns a matrix of standardized regression slopes, standard errors, test statistics, degrees of freedom, p-values, and confidence intervals.

## Author(s)

Ivan Jacob Agaloos Pesigan

```
object <- glm(
  formula = vs ~ wt + disp,
  family = "binomial",
  data = mtcars
)
def <- list("exp(wt)", "exp(disp)")
out <- DeltaGeneric(
  object = object,
  def = def,
  alpha = 0.05
)
summary(out)</pre>
```

summary.diffbetadelta

summary.diffbetadelta Summary Method for an Object of Class diffbetadelta

## Description

Summary Method for an Object of Class diffbetadelta

## Usage

```
## S3 method for class 'diffbetadelta'
summary(object, alpha = NULL, digits = 4, ...)
```

## **Arguments**

object Object of class diffbetadelta. 
alpha Numeric vector. Significance level  $\alpha$ . If alpha = NULL, use the argument alpha used in object. 
digits Digits to print. 
additional arguments.

#### Value

Returns a matrix of standardized regression slopes, standard errors, test statistics, degrees of freedom, p-values, and confidence intervals.

#### Author(s)

Ivan Jacob Agaloos Pesigan

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
diff <- DiffBetaDelta(std)
summary(diff)</pre>
```

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vcov.betadelta

Sampling Covariance Matrix of the Standardized Regression Slopes

## **Description**

Sampling Covariance Matrix of the Standardized Regression Slopes

## Usage

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

## Arguments

```
object Object of class betadelta.
... additional arguments.
```

## Value

Returns a matrix of the variance-covariance matrix of standardized slopes.

#### Author(s)

Ivan Jacob Agaloos Pesigan

## **Examples**

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
vcov(std)</pre>
```

vcov.deltamethod

Sampling Covariance Matrix

## Description

Sampling Covariance Matrix

## Usage

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

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#### **Arguments**

```
object Object of class deltamethod.
... additional arguments.
```

## Value

Returns a matrix of the variance-covariance matrix.

#### Author(s)

Ivan Jacob Agaloos Pesigan

## **Examples**

```
object <- glm(
  formula = vs ~ wt + disp,
  family = "binomial",
  data = mtcars
)
def <- list("exp(wt)", "exp(disp)")
out <- DeltaGeneric(
  object = object,
  def = def,
  alpha = 0.05
)
vcov(out)</pre>
```

vcov.diffbetadelta

Sampling Covariance Matrix of Differences of Standardized Regression Slopes

## **Description**

Sampling Covariance Matrix of Differences of Standardized Regression Slopes

#### Usage

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

## Arguments

object Object of class diffbetadelta. ... additional arguments.

## Value

Returns a matrix of the variance-covariance matrix of differences of standardized regression slopes.

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## Author(s)

Ivan Jacob Agaloos Pesigan

```
object <- lm(QUALITY ~ NARTIC + PCTGRT + PCTSUPP, data = nas1982)
std <- BetaDelta(object)
diff <- DiffBetaDelta(std)
vcov(diff)</pre>
```

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