

# Package ‘cbq’

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**Title** Conditional Binary Quantile Models

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**Description** Estimates conditional binary quantile models developed by Lu (2020) <[doi:10.1017/pan.2019.29](https://doi.org/10.1017/pan.2019.29)>. The estimation procedure is implemented based on Markov chain Monte Carlo methods.

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## R topics documented:

cbq-package . . . . .	2
cbq . . . . .	2
coef.cbq . . . . .	5
dald . . . . .	6
inverse . . . . .	6
is.dichotomous . . . . .	7
pald . . . . .	7
plot.cbq . . . . .	8

plot_coef.cbq . . . . .	8
plot_trace.cbq . . . . .	9
predict.cbq . . . . .	9
print.cbq . . . . .	10
print_coef.cbq . . . . .	10
print_mcmc.cbq . . . . .	11
print_text.cbq . . . . .	11
qald . . . . .	12
rald . . . . .	12

<b>Index</b>	<b>13</b>
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cbq-package	<i>cbq: An R Package for Estimating Conditional Binary Quantile Models</i>
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## Description

Bayesian estimation of conditional binary quantile models.

## References

Lu, Xiao. (2020). Discrete Choice Data with Unobserved Heterogeneity: A Conditional Binary Quantile Model. *Political Analysis*, 28(2), 147-167. <https://doi.org/10.1017/pan.2019.29>

Stan Development Team (2019). RStan: the R interface to Stan. R package version 2.19.2. <https://mc-stan.org>

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cbq	<i>Fitting conditional binary quantile models</i>
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## Description

The main function for running the conditional binary quantile model. The function returns a cbq object that can be further investigated using standard functions such as plot, print, coef, and predict.

## Usage

```
cbq(
  formula,
  data,
  q = NULL,
  vi = FALSE,
  nsim = 1000,
  grad_samples = 1,
  elbo_samples = 100,
```

```

    tol_rel_obj = 0.01,
    output_samples = 2000,
    burnin = NULL,
    thin = 1,
    CIsizes = 0.95,
    nchain = 1,
    seeds = 12345,
    inverse_distr = FALSE,
    offset = 1e-20,
    mc_core = 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.
data	A data frame containing the variables in the model.
q	The quantile value.
vi	Indicating whether variational inference should be used instead of MCMC sampling procedure.
nsim	The number of iterations.
grad_samples	Passed to <code>vb</code> (positive integer), the number of samples for Monte Carlo estimate of gradients, defaulting to 1.
elbo_samples	Passed to <code>vb</code> (positive integer), the number of samples for Monte Carlo estimate of ELBO (objective function), defaulting to 100. (ELBO stands for "the evidence lower bound".)
tol_rel_obj	Passed to <code>vb</code> (positive double), the convergence tolerance on the relative norm of the objective, defaulting to 0.01.
output_samples	Passed to <code>vb</code> (positive integer), number of posterior samples to draw and save, defaults to 1000.
burnin	The number of burnin iterations.
thin	Thinning parameter.
CIsizes	The size of confidence interval.
nchain	The number of parallel chains.
seeds	Random seeds to replicate the results.
inverse_distr	If FALSE, the ALD will not be reversed. The default is FALSE.
offset	Offset values to enhance sampling stability. The default value is 1e-20.
mc_core	Indicating whether the estimation will be run in multiple parallel chains. The default is TRUE.

### Details

The model can be passed either as a combination of a formula and a data frame `data`, as in `lm()`. Convergence diagnostics can be performed using either `print(object, "mcmc")` or `plot(object, "mcmc")`.

**Value**

A cbq object, which can be further analyzed with its associated `plot.cbq`, `coef.cbq` and `print.cbq` functions.

An object of class cbq contains the following elements

`Call` The matched call.

`formula` Symbolic representation of the model.

`q` The quantile value.

`nsim` The number of MCMC iterations.

`burnin` The number of burnin periods.

`thin` Thinning.

`seeds` Random seeds.

`CIsize` The size of confidence interval.

`data` Data used.

`x` Covaraites used.

`y` The dependent variable.

`xnames` Names of the covariates.

`stanfit` Outputs from stan.

`sampldf` A matrix of posterior samples.

`summaryout` A summary based on posterior samples.

`npars` Number of covariates.

`ulbs` Lower and upper confidence bounds.

`means` Estimates at the mean.

`vi` Indicating whether variational inference has been performed.

`output_samples` Sample outputs.

`fixed_var` Variables estimated using fixed effects.

`random_var` Variables estimated using random effects.

`xq` Variables indicating the choice sets.

**Author(s)**

Xiao Lu

**References**

Lu, Xiao. (2020). Discrete Choice Data with Unobserved Heterogeneity: A Conditional Binary Quantile Model. *Political Analysis*, 28(2), 147-167. <https://doi.org/10.1017/pan.2019.29>

**Examples**

```
# Simulate the data
x <- rnorm(50)
y <- ifelse(x > 0, 1, 0)
dat <- as.data.frame(cbind(y, x))

# Estimate the CBQ model
model <- cbq(y ~ x, dat, 0.5, nchain = 1, mc_core = FALSE)

# Show the results
print(model)
coef(model)
plot(model)
```

---

`coef.cbq`*Extract CBQ Coefficients*

---

**Description**

Create a table of coefficient results from a cbq object.

**Usage**

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

**Arguments**

<code>object</code>	A cbq object.
<code>...</code>	Further arguments passed to or from other methods.

**Value**

A table of coefficients with their corresponding lower and upper bounds.

---

<code>dald</code>	<i>Probability density function of asymmetric Laplace distributions</i>
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---

**Description**

`dald` calculates probability densities of asymmetric Laplace distributions.

**Usage**

```
dald(x, mu, p, sigma)
```

**Arguments**

<code>x</code>	Random variable.
<code>mu</code>	Position parameter.
<code>p</code>	Quantile.
<code>sigma</code>	Scale parameter.

**Value**

probability density of `x`.

---

<code>inverse</code>	<i>Inverse function</i>
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**Description**

`inverse` generates inverse function of any given function.

**Usage**

```
inverse(f, mu, p, sigma, lower = -10000, upper = 10000)
```

**Arguments**

<code>f</code>	<code>pald</code> function
<code>mu</code>	Position parameter.
<code>p</code>	Quantile.
<code>sigma</code>	Scale parameter.
<code>lower</code>	Lower bound.
<code>upper</code>	Upper bound.

**Value**

inversed `pald`

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is.dichotomous	<i>Check if a predictor is dichotomous, adopted from package circGLM</i>
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---

**Description**

Check if a predictor is dichotomous, adopted from package circGLM

**Usage**

```
is.dichotomous(x)
```

**Arguments**

x                    A character or numerical vector to be tested.

**Value**

A logical, TRUE if the x has dummy coding (0, 1), FALSE otherwise.

---

pald	<i>Cumulative density function of asymmetric Laplace distributions</i>
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---

**Description**

pald calculates cumulative densities of asymmetric Laplace distributions.

**Usage**

```
pald(x, mu, p, sigma)
```

**Arguments**

x                    Random variable.  
mu                   Position parameter.  
p                    Quantile.  
sigma                Scale parameter.

**Value**

cumulative probability density of x.

---

 plot.cbq

*Plot cbq object*


---

**Description**

General plot function for cbq objects, which dispatches the chosen type of plotting to the corresponding function.

**Usage**

```
## S3 method for class 'cbq'
plot(x, type = "trace", ...)
```

**Arguments**

x	A cbq object to be plotted.
type	Character string giving the type of plotting. The options are "trace" for trace plots, "coef" for coefficient plots. The default is the traceplot.
...	Additional arguments to be passed to subsequent plot functions.

**Value**

None.

---

plot\_coef.cbq

*Make coefficient plots for cbq*


---

**Description**

Plot traceplots from a cbq object.

**Usage**

```
plot_coef.cbq(object, ...)
```

**Arguments**

object	A cbq object.
...	Additional parameters to be passed to the plot function.

**Value**

None.



---

plot_trace.cbq	<i>Make traceplots for cbq</i>
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**Description**

Plot traceplots from a cbq object.

**Usage**

```
plot_trace.cbq(object, ...)
```

**Arguments**

object	A cbq object.
...	Additional parameters to be passed to the traceplot function.

**Value**

None.

---

predict.cbq	<i>Predictions based on the fitted parameter values</i>
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**Description**

Create a vector of predictions from a cbq object.

**Usage**

```
## S3 method for class 'cbq'  
predict(object, data, ci = 0.95, ...)
```

**Arguments**

object	A cbq object.
data	Data used for prediction.
ci	Confidence interval. The default is 0.95.
...	Further arguments passed to or from other methods.

**Value**

A vector of predictions.

---

 print.cbq

*Print cbq object*


---

**Description**

General print function for cbq objects, which dispatches the chosen type of printing to the corresponding function.

**Usage**

```
## S3 method for class 'cbq'
print(x, type = "text", ...)
```

**Arguments**

x	A cbq object to be printed.
type	Character string giving the type of printing, such as "text", "mcmc", "coef".
...	Additional arguments to be passed to print functions.

**Value**

None.

---

print\_coef.cbq

*Print cbq coefficients*


---

**Description**

Print cbq coefficients

**Usage**

```
print_coef.cbq(object, digits = 3)
```

**Arguments**

object	A cbq object.
digits	Number of digits to display.

**Value**

None.

---

print_mcmc.cbq	<i>Print the mcmc results from a cbq object</i>
----------------	---

---

**Description**

This prints a number of diagnostics about the results of a cbq objects

**Usage**

```
print_mcmc.cbq(object, ...)
```

**Arguments**

object	A cbq object.
...	Additional arguments to be passed to the print function.

**Value**

None.

---

print_text.cbq	<i>Print the main results from a cbq object.</i>
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**Description**

Print the main results from a cbq object.

**Usage**

```
print_text.cbq(object, digits = 3)
```

**Arguments**

object	A cbq object.
digits	Number of digits to display.

---

qald	<i>Quantile function of asymmetric Laplace distributions</i>
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**Description**

qald calculates quantiles values of asymmetric Laplace distributions.

**Usage**

```
qald(y, mu, p, sigma)
```

**Arguments**

y	quantile value.
mu	Position parameter.
p	Quantile.
sigma	Scale parameter.

**Value**

quantile value.

---

rald	<i>Random number generator of asymmetric Laplace distributions</i>
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---

**Description**

rald generates random numbers from asymmetric Laplace distributions.

**Usage**

```
rald(n, mu, p, sigma)
```

**Arguments**

n	Number of random numbers to be generated.
mu	Position parameter.
p	Quantile.
sigma	Scale parameter.

**Value**

random numbers.

# Index

cbq, 2  
cbq-package, 2  
coef.cbq, 4, 5  
  
dald, 6  
  
inverse, 6  
is.dichotomous, 7  
  
pald, 7  
plot.cbq, 4, 8  
plot\_coef.cbq, 8  
plot\_trace.cbq, 9  
predict.cbq, 9  
print.cbq, 4, 10  
print\_coef.cbq, 10  
print\_mcmc.cbq, 11  
print\_text.cbq, 11  
  
qald, 12  
  
rald, 12  
  
vb, 3