# Package 'good'

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Type Package

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Version 1.0.1
Description  Fit Good regression models to count data (Tur et al., 2021) <arxiv:2105.01557>. The package provides functions for model estimation and model prediction. Density, distribution function, quantile function and random generation for the Good distribution are also provided.</arxiv:2105.01557>
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dgood

Probability mass function for the Good distribution

## **Description**

Probability mass function for the Good distribution with parameters z and s.

## Usage

## **Arguments**

x vector of non-negative integer quantiles.

z vector of first parameter for the Good distribution.

s vector of second parameter for the Good distribution.

#### **Details**

The Good distribution has the probability mass function (pmf):

$$P(X = x) = (1/F(z, s)) \cdot (z^{(x+1)}/(x+1)^s),$$

where  $x = 0, 1, 2 \dots$  Parameter z should be within the interval (0, 1), and parameter s in the reals. F(z, s) is the polylogarithm function:

$$F(z,s) = \sum_{i=1}^{\infty} z^n / n^s,$$

and acts in the pmf as the normalizing constant.

If F(z,s) does not converge (e.g., for large negative values of the parameter s), the following approximation is used instead:

$$F(z,s) \approx \Gamma(1-s) \cdot (-\log(z))^{(s-1)}$$

and dgood returns approximated probabilities:

$$P(X = x) \approx \exp((x+1) \cdot \log(z) - s \cdot \log(x+1) - \log(\Gamma(1-s)) - (s-1) \cdot \log(-\log(z))).$$

## Value

dgood gives the probability mass function for the Good distribution with parameters z and s. x should be a vector of non-negative integer quantiles. If x is non-integer and/or negative, dgood returns 0 with a warning. z and s can be vectors with values within the interval (0,1) and the reals respectively. If vector z has negative values and/or outside the interval (0,1), dgood returns NaN with a warning.

If function polylog from package **copula** returns Inf (e.g., for large negative values of parameter s), dgood uses the approximation described above for probabilities, and additionally returns an informative warning.

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#### Author(s)

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#### References

Good, J. (1953). The population frequencies of species and the estimation of population parameters. Biometrika, 40: 237–264.

Zörnig, P. and Altmann, G. (1995). Unified representation of zipf distributions. Computational Statistics & Data Analysis, 19: 461–473.

Kulasekera, K.B. and Tonkyn, D. (1992). A new distribution with applications to survival dispersal and spersion. Communication in Statistics - Simulation and Computation, 21: 499–518.

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Johnson, N.L., Kemp, A.W. and Kotz, S. Univariate Discrete Distributions. Wiley, Hoboken, 2005.

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Wood, D.C. (1992). The Computation of Polylogarithms. Technical report. UKC, University of Kent, Canterbury, UK (KAR id:21052).

## See Also

See also polylog from copula, pgood, and ggood and rgood from good.

```
# if x is not a non-negative integer, dgood returns 0 with a warning dgood ( x = -3 , z = c ( 0.6 , 0.5 ) , s = -3 ) dgood ( x = 4.5 , z = c ( 0.6 , 0.5 ) , s = -3 )

# if z is not within 0 and 1, dgood returns NaN with a warning dgood ( x = 4 , z = c ( 0.6 , 0.5 , -0.9 ) , s = -3 )

# if the approximation is used, dgood returns a warning dgood ( x = 330 : 331 , z = c ( 0.6 , 0.5 ) , s = -170 )

dgood ( x = 4 , z = 0.6 , s = -3 )

dgood ( x = 4 , z = c ( 0.6 , 0.5 ) , s = c ( 0.6 , 0.5 ) , 0.5 ) , 0.5 , 0.5 ) dgood ( 0.5 ) , 0.5 , 0.5 ) dgood ( 0.5 ) , 0.5 , 0.5 ) , 0.5 , 0.5 ) dgood ( 0.5 ) , 0.5 , 0.5 , 0.5 ) , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0.5 , 0
```

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glm.good

Maximum Likelihood Estimation and Good Regression

## **Description**

glm.good is used to fit generalized linear models with a response variable following a Good distribution with parameters z and s. glm.good allows incorporating predictors in the model with a link function (log, logit and identity) that relates parameter z and predictors. A summary method over an object of class glm.good provides essential information regarding the fitted model such as parameters estimates, standard errors, and some goodness-of-fit measures. A prediction method over an object of class glm.good provides the fitted values with the estimated model and optionally standard errors and predictions for a new data set.

#### Usage

```
glm.good ( formula , data , link = "log" , start = NULL )
```

## Arguments

symbolic description of the model to be fitted. A typical predictor has the form response ~ terms where the response is the integer-valued response vector following a Good distribution with parameters s and z, and terms is a series of predictors.

data an optional data frame with the variables in the model.

link character specification of link function: "logit", "log" or "identity". By default link="log".

start a vector with the starting values for the model parameters. Used for numerically

maximize the likelihood function for parameters estimation. By default start =

NULL.

#### Value

glm. good returns an object of class glm. good that is a list including:

coefs The vector of coefficients.

loglik Log-likelihood of the fitted model.

vcov Variance-covariance matrix of all model parameters (derived from the Hessian

matrix returned by nlm()).

hess Hessian matrix, returned by nlm().

fitted.values The fitted mean values. These are obtained by transforming the linear predictors

by the link function inverse.

#### Author(s)

Jordi Tur, David Moriña, Pere Puig, Alejandra Cabaña, Argimiro Arratia, Amanda Fernández-Fontelo

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#### References

Good, J. (1953). The population frequencies of species and the estimation of population parameters. Biometrika, 40: 237–264.

Zörnig, P. and Altmann, G. (1995). Unified representation of zipf distributions. Computational Statistics & Data Analysis, 19: 461–473.

Kulasekera, K.B. and Tonkyn, D. (1992). A new distribution with applications to survival dispersal and spersion. Communication in Statistics - Simulation and Computation, 21: 499–518.

Doray, L.G. and Luong, A. (1997). Efficient estimators for the good family. Communications in Statistics - Simulation and Computation, 26: 1075–1088.

Johnson, N.L., Kemp, A.W. and Kotz, S. Univariate Discrete Distributions. Wiley, Hoboken, 2005.

Kemp. A.W. (2010). Families of power series distributions, with particular reference to the lerch family. Journal of Statistical Planning and Inference, 140:2255–2259.

Wood, D.C. (1992). The Computation of Polylogarithms. Technical report. UKC, University of Kent, Canterbury, UK (KAR id:21052).

## See Also

See also polylog from **copula**, dgood, and pgood, qgood and rgood from **good**, and maxLik from **maxLik**.

## **Examples**

```
strikes <- c ( rep ( 0, 46 ) , rep ( 1, 76 ) , rep ( 2, 24 ) , rep ( 3, 9 ) , rep ( 4, 1 ) )
mle <- glm.good ( strikes ~ 1 , link = "log" )
names ( mle )
mle$coefficients
mle$fitted.values
mean ( strikes )
summary ( mle )
predict ( mle , newdata = NULL , se.fit = TRUE )</pre>
```

pgood

Distribution function for the Good distribution

## **Description**

Distribution function for the Good distribution with parameters z and s.

#### Usage

```
pgood ( q , z , s , lower.tail = TRUE )
```

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## Arguments

q	vector of non-negative integer quantiles.		
z	vector of first parameter for the Good distribution.		
S	vector of second parameter for the Good distribution.		
lower.tail	logical; if TRUE (default), probabilities are $P(X \le x)$ . Otherwise, $P(X > x)$ .		

#### Value

pgood returns the cumulative distribution function (cdf) for the Good distribution with parameters z and s. Parameter z should be within the interval (0,1), and parameter s in the reals. If q is non-integer, pgood returns the cdf of floor(q) with a warning. If q is negative, pgood returns 0 with a warning, pgood calls dgood from package **good**.

## Author(s)

Jordi Tur, David Moriña, Pere Puig, Alejandra Cabaña, Argimiro Arratia, Amanda Fernández-Fontelo

#### References

Good, J. (1953). The population frequencies of species and the estimation of population parameters. Biometrika, 40: 237–264.

Zörnig, P. and Altmann, G. (1995). Unified representation of zipf distributions. Computational Statistics & Data Analysis, 19: 461–473.

Kulasekera, K.B. and Tonkyn, D. (1992). A new distribution with applications to survival dispersal and and Samuelation. Communication in Statistics - Simulation and Computation, 21: 499–518.

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Kemp. A.W. (2010). Families of power series distributions, with particular reference to the lerch family. Journal of Statistical Planning and Inference, 140:2255–2259.

Wood, D.C. (1992). The Computation of Polylogarithms. Technical report. UKC, University of Kent, Canterbury, UK (KAR id:21052).

#### See Also

See also polylog from copula, dgood, and ggood and rgood from good.

```
# if q < 0, pgood returns NaN with a warning pgood ( q=-3 , z=0.6 , s=-3 ) # if q is non-integer, pgood returns the cdf of floor(q) with a warning pgood ( q=3.4 , z=0.6 , s=-3 ) # if z is not within 0 and 1, pgood returns returns NaN with a warning
```

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```
pgood ( q = 3.4 , z = c( -0.6 , 0.6) , s = -3 )

pgood ( q = 0 : 2 , z = 0.6 , s = -3 )
pgood ( q = 0 : 1 , z = c ( 0.6 , 0.9 ) , s = -3 )
pgood ( q = 0 : 1 , z = c ( 0.6 , 0.9 ) , s = -3 , lower.tail = FALSE )
pgood ( q = 0 : 2 , z = c ( 0.6 , 0.9 ) , s = c ( -3 , -4 , -5 ) )
```

polar

Polar bear litter size data set

## **Description**

This data set corresponds to live-captured polar bears from late March 1992 to beginning of May 2017 at Svalbard, Norway.

## Usage

```
data(polar)
```

#### **Format**

A data frame with 231 rows and 7 columns.

year Catch year

days Number of the day of the catch year

id Unique specimen id

age Age of the specimen, estimated using premolar tooth

agecat Categorized age of the specimen

length Body straight length (cm)

cubnumber Litter size

## Source

Folio, Dorinda Marie et al. (2019), Data from: How many cubs can a mum nurse? Maternal age and size influence litter size in polar bears, Dryad, Dataset.

#### References

Folio D. M., Aars J., Gimenez O., Derocher A. E., Wiig O. and Cubaynes S. (2019) How many cubs can a mum nurse? Maternal age and size influence litter size in polar bears, Biology letters, 15.

```
data(polar)
head(polar)
```

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Quantile function for the Good distribution

## **Description**

Quantile function for the Good distribution with parameters z and s.

## Usage

```
qgood (p, z, s, lower.tail = TRUE)
```

## **Arguments**

p vector of non-negative integer quantiles.

z vector of first parameter for the Good distribution.

s vector of second parameter for the Good distribution.

lower.tail logical; if TRUE (default), probabilities are  $P(X \le x)$ . Otherwise, P(X > x).

#### Value

The smallest integer x such that  $P(X \le x) \ge p$  (or such that  $P(X \le x) \ge 1-p$  if lower.tail is FALSE), where X is a random variable following a Good distribution with parameters z and s. Parameter z should be within the interval (0,1), and parameter s in the reals. Vector p should have values between 0 and 1. If vector p has negative values and/or outside the interval (0,1), agood returns NaN with a warning. If vector p contains 1, agood returns Inf. agood calls agood from package **good**.

## Author(s)

Jordi Tur, David Moriña, Pere Puig, Alejandra Cabaña, Argimiro Arratia, Amanda Fernández-Fontelo

## References

Good, J. (1953). The population frequencies of species and the estimation of population parameters. Biometrika, 40: 237–264.

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Wood, D.C. (1992). The Computation of Polylogarithms. Technical report. UKC, University of Kent, Canterbury, UK (KAR id:21052).

#### See Also

See also polylog from copula, dgood, and pgood and rgood from good.

## **Examples**

```
# if p is not within [0, 1], NaN is returned with a warning
qgood ( p = c ( -0.6 , 1.3 ) , z = 0.5 , s = -3 )

# if z is not within 0 and 1, NaN is returned with a warning
qgood ( p = 0.5 , z = c(-0.6, -9, 0.5) , s = -3 )

qgood ( p = 0.5 , z = 0.6 , s = -3 )
qgood ( p = c ( 0.025 , 0.5 , 0.975 ) , z = 0.6 , s = -3 )
qgood ( p = c ( 0.025 , 0.5 , 0.975 ) , z = c ( 0.6 , 0.3 , 0.1 ) , s = -5 )
qgood ( p = c ( 0.025 , 0.5 , 0.975 ) , z = c ( 0.6 , 0.3 , 0.5 ) , s = -3 , lower.tail = FALSE )
qgood ( p = c ( 0.025 , 0.5 , 0.975 ) , z = c ( 0.6 , 0.3 ) , s = -3 )
```

rgood

Random generation for the Good distribution

## Description

Random generation for the Good distribution with parameters z and s.

#### **Usage**

```
rgood ( n , z , s , th = 10^{-6} )
```

## Arguments

n vector of number of observations to be generated vector of first parameter for the Good distribution s vector of second parameter for the Good distribution th defines the lower  $(q_1)$  and upper  $(q_2)$  quantiles such that  $P(X \le q_1) = th$  and  $P(X \le q_2) = 1 - th$  respectively.

## Value

A vector containing n random deviates from a Good distribution with parameters z and s. Parameter z should be within the interval (0,1), and parameter s in the reals. rgood returns NaN if either arguments n or th are negative. rgood calls qgood and pgood from package **good**.

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#### Author(s)

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#### References

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Wood, D.C. (1992). The Computation of Polylogarithms. Technical report. UKC, University of Kent, Canterbury, UK (KAR id:21052).

#### See Also

See also polylog from **copula**, dgood, and pgood and ggood from **good**.

```
# if n is not a non-negative interger, function returns NaN with a warning rgood ( n = -100 , z = 0.5 , s = -3 )  
# if th is not positive, th is replaced by 1e-06 and a warning is provided rgood ( n = 1 , z = 0.5 , s = -3 , th = -9 )  
# if z is not within 0 and 1, NaN is returned with a warning rgood ( n = 2 , z = c( -0.5, 0.5 ) , s = -3 )  

rgood ( n = 10 , z = 0.6 , s = -3 )  

rgood ( n = 1000 , z = 0.6 , s = -3 )  

rgood ( n = c ( 3 , 10 ) , z = 0.6 , s = -3 )  

rgood ( n = c ( 3 , 10 ) , z = c ( 0.2 , 0.8 ) , s = - 3 )  

rgood ( n = c ( 3 , 10 , 6 ) , z = c ( 0.2 , 0.8 ) , s = c ( - 3 , -2 ) )  

rgood ( n = 1000 , z = 0.3 , s = -170 )
```

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